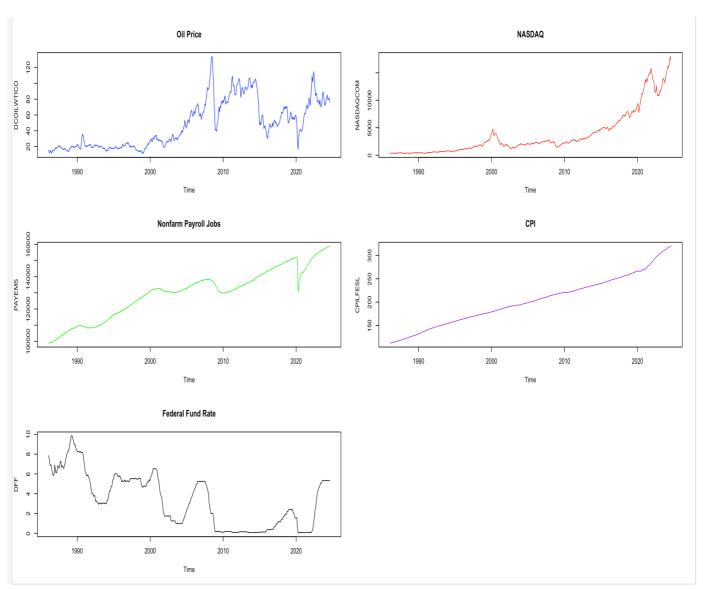
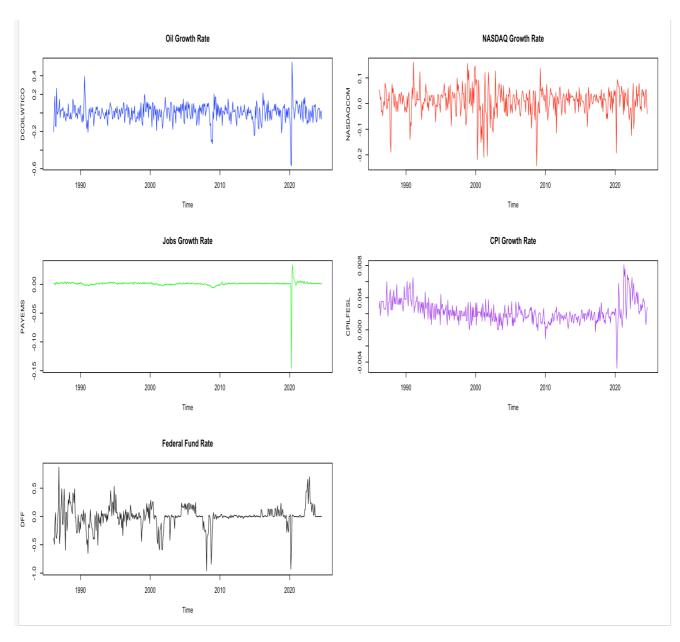
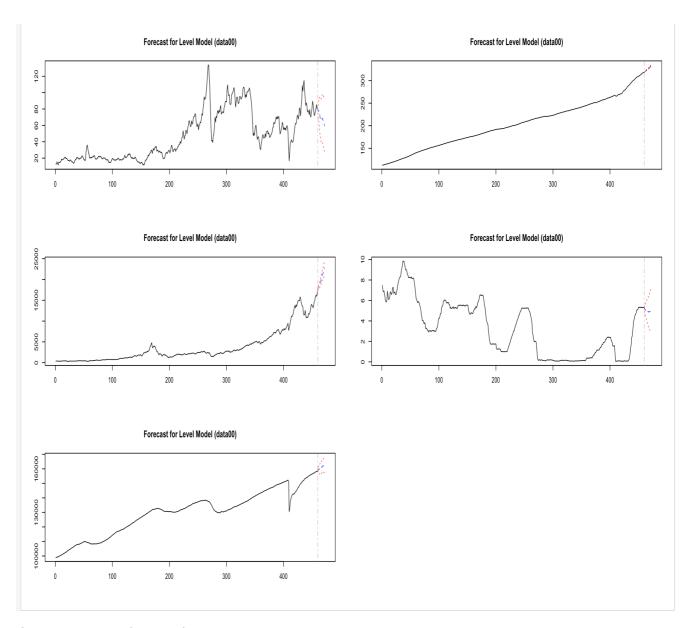
Armaan Dhanda Assignment 4



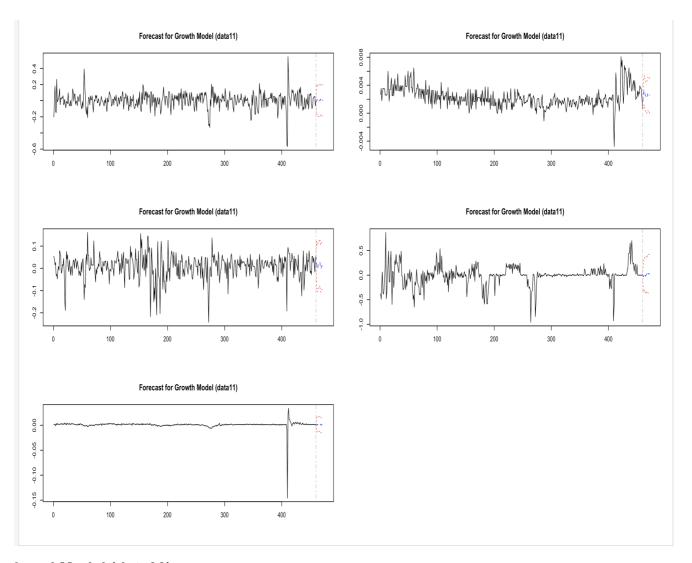
applied (diff()) for FFr and log(diff()) for rest



Level Model (data00) Forecast:



Growth Model (data11):



Level Model (data00):

- Forecast Pattern: The level model seems to provide smoother, more linear forecasts for variables like non-farm payrolls, CPI, and Federal Fund Rate (FFR). This is because the model operates directly on the levels of the series, including both constant and trend components. For example:
 - o **Oil prices** (first panel, top-left) show some volatility in the forecast but maintain a consistent trend.
 - Stock prices (top-right) exhibit a relatively stable upward trend without much deviation.
 - CPI (bottom-left) shows steady growth, while FFR (bottom-right) is forecasted to slightly increase or remain stable.
- **Stability**: Since this model operates on levels, it tends to capture the general trend over time, providing forecasts that are more predictable and smooth, especially for variables that exhibit long-term growth (like stock prices or payrolls).

• **Drawback**: If the data has underlying growth dynamics or structural changes, the level model may not capture the nuances in short-term fluctuations, which is often reflected in the smoothness of the forecasts.

Growth Model (data11):

- Forecast Pattern: The growth model's forecasts (differenced data) show more short-term volatility and fluctuations compared to the level model. For example:
 - Oil prices show significant oscillations in the growth rates, which makes the forecast appear less smooth.
 - Stock prices similarly show fluctuations but with smaller deviations than the oil prices.
 - CPI and FFR also exhibit relatively small fluctuations in the forecast but remain much closer to the zero-growth line.
- Interpretation: The growth model captures the short-term variations or percentage changes in the series, which leads to greater sensitivity to small changes in the data. This is why the forecasted growth rates are more volatile compared to the level forecasts.
- **Drawback**: The growth model might be **too reactive** to short-term fluctuations and could lead to overfitting, as the forecasted values are more sensitive to recent movements in the data.

Differences Between the Models:

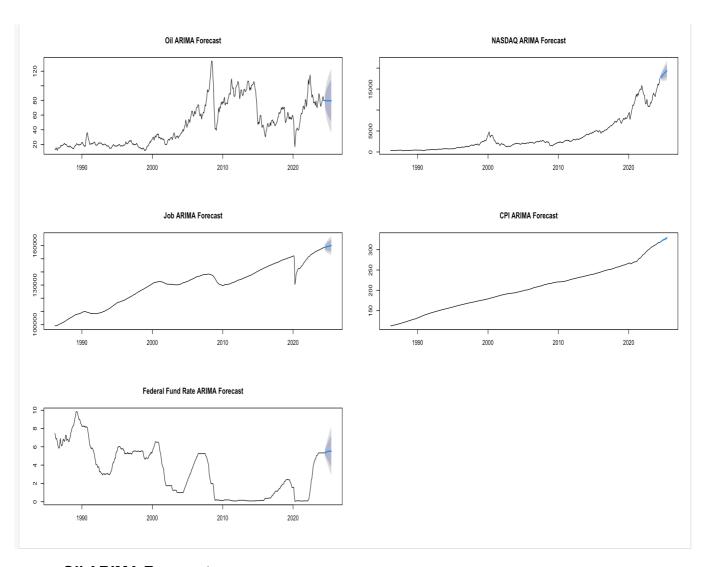
- Volatility: The growth model forecast is more volatile, capturing small fluctuations in the data. This makes sense because the model is forecasting changes (differenced data), which can reflect short-term dynamics more prominently.
 - The level model is smoother, indicating that it captures long-term trends but may miss short-term variability.

2. Long-term Trends vs Short-term Fluctuations:

- Level Model: This model is better at capturing long-term trends in the data, such as stock prices or payrolls, which tend to follow a more predictable path over time.
- Growth Model: This model focuses more on capturing the immediate changes in the data, making it better at modeling short-term fluctuations but potentially overreactive for stable variables.

Residual Standard Error and Fit:

- The **Level model** achieves higher **R-squared values** (e.g., for job_ts, adjusted R-squared ~0.99), indicating a stronger fit due to the cumulative nature of the data.
- The **Growth model**, by contrast, has more moderate fit (e.g., adjusted R-squared around 0.27–0.56), reflecting the noisier nature of growth rates and short-term volatility.



Oil ARIMA Forecast:

 Shows fluctuations with a slight upward forecast but relatively wide confidence intervals, indicating uncertainty about future trends.

NASDAQ ARIMA Forecast:

 Strong upward trend with increasing variability reflected in the widening confidence intervals. This suggests the ARIMA model predicts continued stock market growth with some uncertainty.

Job ARIMA Forecast:

 Continues its upward trend, reflecting economic growth with a smaller confidence interval.

CPI ARIMA Forecast:

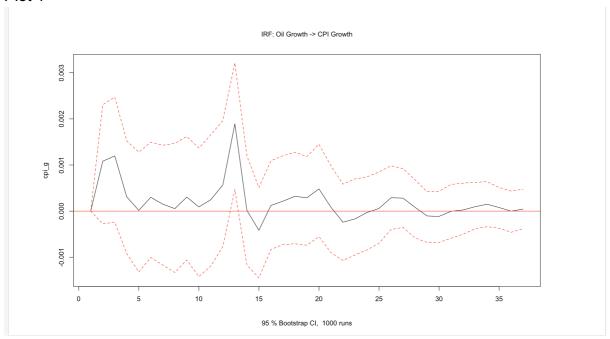
 Displays consistent upward growth, reflecting inflationary pressure with very narrow confidence intervals, showing a more confident prediction.

Federal Fund Rate ARIMA Forecast:

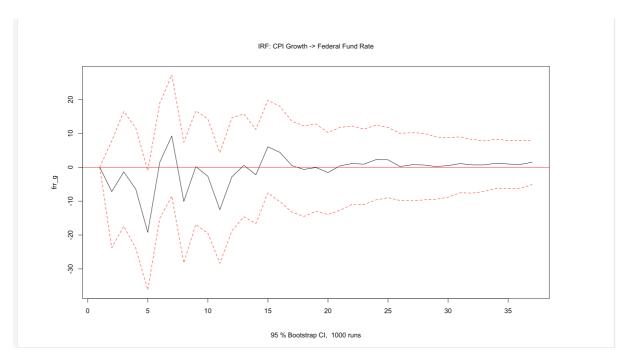
 Predicts a stable trend after the recent rise, but with a wide confidence interval reflecting uncertainty about future monetary policy decisions.

For short-term predictions, ARIMA may be competitive or even better if individual series behave smoothly over time (like CPI or jobs). However, for complex interrelated systems, **VAR models** provide better context and understanding of interactions, particularly for financial data where one variable influences another.

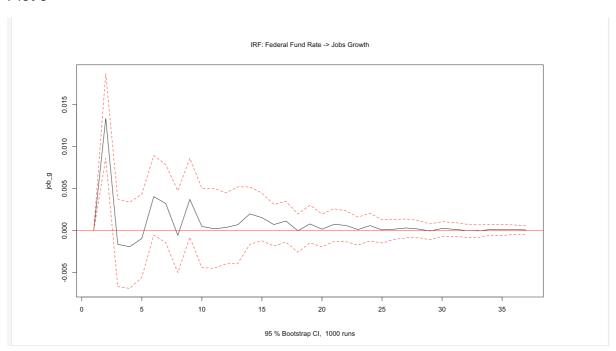
Plot 1



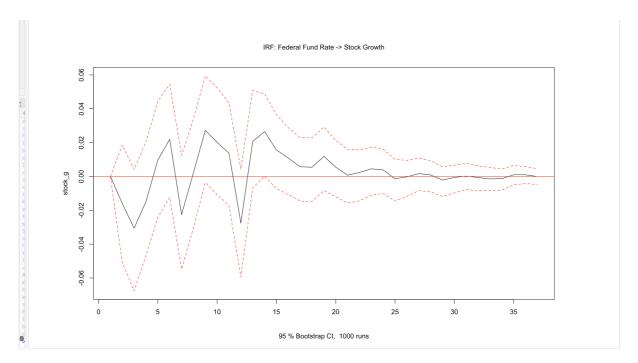
Plot 2



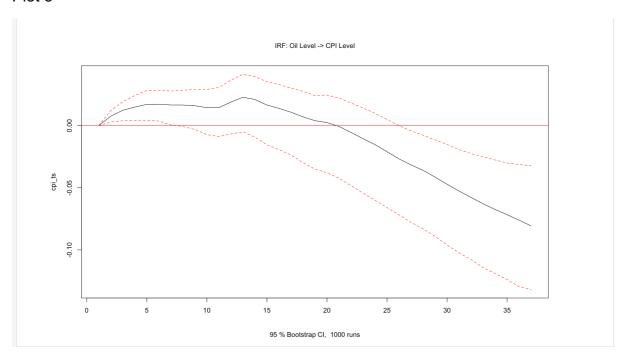
Plot 3



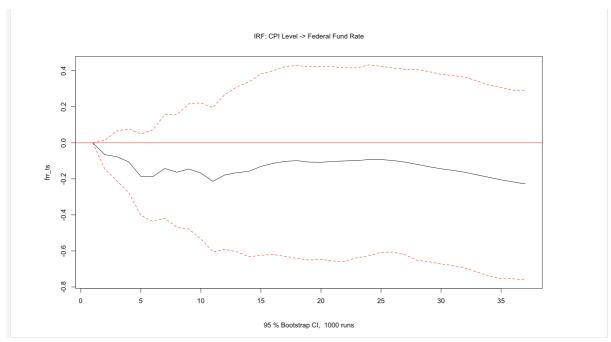
Plot 4



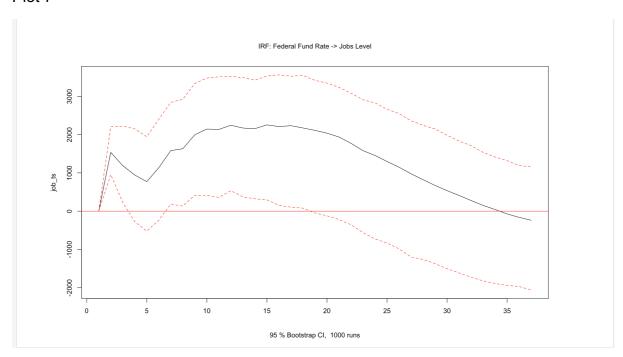
Plot 5



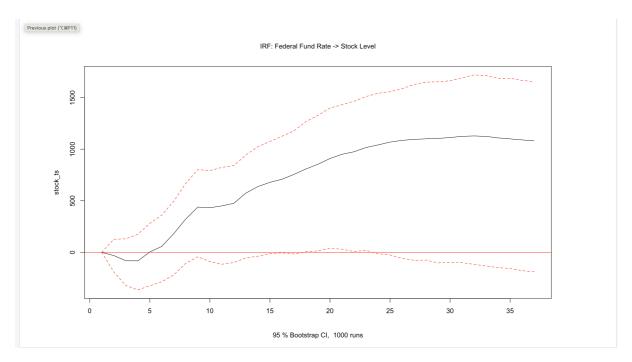
Plot 6



Plot 7



Plot 8



Plot 1: Oil Growth → CPI Growth

• Following an oil price increase, CPI growth initially spikes due to the direct inflationary pressure from higher energy prices. Over time, this effect diminishes and returns to its equilibrium. The confidence intervals suggest that the initial shock is statistically significant but fades.

Plot 2: CPI Growth → Federal Fund Rate

 The Federal Fund Rate initially rises in response to inflation, likely due to central bank interventions aimed at curbing inflationary pressure. After a few periods, the response stabilizes. Uncertainty (as seen by the widening confidence intervals) grows over time, indicating less precise predictions in the long run.

Plot 3: Federal Fund Rate → Job Growth

 A rise in the Federal Fund Rate, often signaling tighter monetary policy, initially causes a spike in job growth, followed by a negative effect where job growth declines. This is likely due to the delayed negative impact of higher interest rates on business investments and hiring. Over time, the effect on jobs stabilizes close to zero, indicating a return to the natural job growth trend.

Plot 4: Federal Fund Rate → Stock Growth

 The stock market tends to react negatively to higher interest rates, reflected in the initial dip in stock growth. Over time, stock growth fluctuates around zero, suggesting a volatile but overall neutral long-term effect. This highlights the immediate adverse reaction of stocks to tighter monetary policy and the mixed effects in subsequent periods.

Plot 5: Oil Level → CPI Level

A rise in oil prices initially causes an upward trend in the CPI level due to the
inflationary impact of higher energy costs. However, after a certain point, the
CPI level begins to decrease as the economy adjusts. The long-term
downward trend may suggest that initial inflationary effects can subside or
even reverse as the economy stabilizes or compensates for higher oil prices.

Plot 6: CPI Level → Federal Fund Rate

Initially, the Federal Fund Rate decreases slightly following a rise in the CPI level. Over time, the central bank seems to increase rates gradually to counter the inflationary effects of a higher CPI, followed by a long-term stabilization.
 The initial decrease might reflect a lag in policy adjustments, while the longer-term upward trend indicates a policy response to inflationary pressures.

Plot 7: Federal Fund Rate → Jobs Level

 Following an increase in the Federal Fund Rate, the level of jobs initially spikes before sharply declining, which could reflect delayed negative effects on employment from tighter financial conditions. Over time, job levels gradually stabilize but remain lower than before, suggesting a longer-term negative impact on employment levels due to higher interest rates.

Plot 8: Federal Fund Rate → CPI Growth

 A rise in the Federal Fund Rate initially causes fluctuations in CPI growth, with the rate eventually declining, suggesting that higher interest rates help to moderate inflation over time. This aligns with central bank policies aimed at reducing inflation by tightening monetary conditions.

Summary:

- **Oil shocks** tend to have a short-term impact on inflation, and oil price increases generally lead to inflationary pressures.
- The **federal funds rate** is used as a tool to respond to inflationary changes, but its impact on job and stock market growth is negative in the short term.
- **Long-term effects** such as the response of jobs and inflation to interest rates are significant but display uncertainty over time.
- > # Output the MSLE results
- > cat("MSLE for VAR Level model: ", msle var level, "\n")
- MSLE for VAR Level model: 0.001206959
- > cat("MSLE for VAR Growth model: ", msle_var_growth, "\n")
- MSLE for VAR Growth model: 0.0004811428
- > cat("MSLE for ARIMA model: ", msle_arima, "\n")
- MSLE for ARIMA model: 0.000382364

Arima is just a little better than the var growth model . For short-term predictions, ARIMA may be competitive or even better

```
> lag_length <- 12
>
> # Run the VAR model on the level data (data00) with both constant and tren
d
> var_level <- VAR(data00, p = lag_length, type = "both")
>
> # Run the VAR model on the growth rate data (data11) with constant only
> var_growth <- VAR(data11, p = lag_length, type = "const")
>
> # Display summaries of both models
> summary(var_level)
```

VAR Estimation Results:

Endogenous variables: oil ts, stock ts, job ts, cpi ts, frr ts

Deterministic variables: both

Sample size: 448

Log Likelihood: -7480.197

Roots of the characteristic polynomial:

1.018 0.99 0.9586 0.9586 0.9577 0.9577 0.9498 0.9498 0.909 0.909 0.9044 0.9044 0.9032 0.9032 0.8987 0.8922 0.8922 0.8869 0.8869 0.874 0.874 0.87 06 0.8706 0.8689 0.8689 0.8579 0.8579 0.8556 0.8556 0.8531 0.8531 0.8531 0.8475 0.8475 0.8389 0.8389 0.8384 0.8384 0.833 0.833 0.8254 0.8254 0.8074 0.80 74 0.8062 0.8062 0.8057 0.8057 0.7873 0.7873 0.7591 0.7591 0.7086 0.7086 0.6982 0.6982 0.6287 0.6287 0.5976 0.5976 0.4177 Call:

VAR(y = data00, p = lag_length, type = "both")

Estimation results for equation oil ts:

oil_ts = oil_ts.l1 + stock_ts.l1 + job_ts.l1 + cpi_ts.l1 + frr_ts.l1 + oil_ts.l2 + stock_ts.l2 + job_ts.l2 + cpi_ts.l2 + frr_ts.l2 + oil_ts.l3 + stock_ts.l3 + job_ts.l3 + cpi_ts.l3 + frr_ts.l3 + oil_ts.l4 + stock_ts.l4 + job_ts.l4 + cpi_ts.l4 + frr_ts.l4 + oil_ts.l5 + stock_ts.l5 + job_ts.l5 + cpi_ts.l5 + frr_ts.l5 + oil_ts.l6 + stock_ts.l6 + job_ts.l6 + cpi_ts.l6 + frr_ts.l6 + oil_ts.l7 + stock_ts.l7 + job_ts.l7 + cpi_ts.l7 + frr_ts.l7 + oil_ts.l8 + stock_ts.l8 + job_ts.l8 + cpi_ts.l8 + frr_ts.l8 + oil_ts.l9 + stock_ts.l9 + job_ts.l9 + cpi_ts.l9 + frr_ts.l9 + oil_ts.l10 + stock_ts.l10 + job_ts.l11 + cpi_ts.l11 + frr_ts.l11 + oil_ts.l12 + stock_ts.l12 + job_ts.l12 + cpi_ts.l12 + frr_ts.l12 + const + t rend

stock ts.l1 -2.120e-03 1.014e-03 -2.091 0.03718 * -1.151e-03 2.732e-04 -4.211 3.17e-05 *** job ts.l1 2.009e+00 1.203e+00 1.669 0.09584. cpi ts.l1 frr ts.l1 5.515e-01 1.552e+00 0.355 0.72257 -2.687e-01 8.543e-02 -3.145 0.00179 ** oil ts.l2 stock ts.l2 4.615e-03 1.564e-03 2.952 0.00335 ** iob ts.l2 9.030e-04 3.768e-04 2.396 0.01703 * -2.270e+00 1.881e+00 -1.207 0.22816 cpi ts.l2 frr ts.l2 -2.167e+00 2.702e+00 -0.802 0.42306 oil ts.l3 -1.164e-01 8.685e-02 -1.341 0.18084 stock ts.l3 -3.266e-03 1.687e-03 -1.936 0.05362. 1.484e-04 3.789e-04 0.392 0.69541 job ts.l3 cpi ts.l3 1.032e+00 1.963e+00 0.526 0.59934 4.620e-02 2.621e+00 0.018 0.98595 frr ts.l3 oil ts.l4 3.522e-02 8.701e-02 0.405 0.68590 stock ts.l4 -2.833e-04 1.720e-03 -0.165 0.86924 job ts.l4 -6.368e-05 3.755e-04 -0.170 0.86543 1.232e+00 1.970e+00 0.625 0.53223 cpi ts.l4 2.244e+00 2.533e+00 0.886 0.37612 frr ts.l4 oil ts.l5 2.960e-02 8.698e-02 0.340 0.73383 stock ts.l5 2.987e-04 1.734e-03 0.172 0.86330 job ts.l5 -1.233e-04 3.769e-04 -0.327 0.74366 cpi ts.l5 -9.769e-01 1.964e+00 -0.497 0.61913 frr ts.l5 -5.973e-01 2.537e+00 -0.235 0.81403 -1.619e-01 8.802e-02 -1.839 0.06670. oil ts.l6 stock ts.l6 2.694e-03 1.745e-03 1.544 0.12334 2.107e-04 3.795e-04 0.555 0.57904 job ts.l6 cpi ts.l6 -1.103e+00 1.937e+00 -0.569 0.56958 frr ts.l6 1.511e+00 2.525e+00 0.598 0.55000 1.363e-01 8.815e-02 1.547 0.12280 oil ts.l7 stock ts.I7 -9.893e-04 1.734e-03 -0.571 0.56855 -2.621e-04 3.776e-04 -0.694 0.48800 job ts.l7 2.027e-01 1.951e+00 0.104 0.91731 cpi ts.17 -1.603e+00 2.529e+00 -0.634 0.52660 frr ts.I7 1.912e-02 8.852e-02 0.216 0.82907 oil ts.l8 stock ts.l8 -1.865e-04 1.691e-03 -0.110 0.91225 1.008e-05 3.801e-04 0.027 0.97885 job ts.l8 -8.995e-01 1.952e+00 -0.461 0.64523 cpi ts.l8 frr ts.l8 2.502e+00 2.520e+00 0.993 0.32156 -7.957e-02 8.837e-02 -0.900 0.36846 oil_ts.l9 stock ts.l9 8.633e-04 1.720e-03 0.502 0.61605 2.513e-04 3.853e-04 0.652 0.51460 job ts.l9 8.934e-01 1.930e+00 0.463 0.64373 cpi ts.l9 frr ts.l9 -2.179e+00 2.510e+00 -0.868 0.38582 stock ts.I10 -3.649e-03 1.748e-03 -2.087 0.03751 * job ts.l10 -4.669e-04 3.812e-04 -1.225 0.22129 cpi ts.I10 4.209e-01 1.866e+00 0.226 0.82165 frr ts.l10 1.090e-01 2.518e+00 0.043 0.96549

```
stock_ts.l11 3.219e-03 1.737e-03 1.854 0.06453 .
job_ts.l11 3.696e-04 3.487e-04 1.060 0.28978
cpi_ts.l11 -9.028e-01 1.824e+00 -0.495 0.62092
frr_ts.l11 -2.526e-01 2.471e+00 -0.102 0.91865
oil_ts.l12 -6.262e-02 5.448e-02 -1.149 0.25110
stock_ts.l12 -1.797e-03 1.176e-03 -1.528 0.12732
job_ts.l12 1.188e-04 2.477e-04 0.480 0.63176
cpi_ts.l12 3.842e-01 1.122e+00 0.343 0.73214
frr_ts.l12 -2.481e-01 1.453e+00 -0.171 0.86454
const 2.557e+00 7.884e+00 0.324 0.74582
trend 1.269e-02 2.263e-02 0.561 0.57523
---
```

Residual standard error: 4.365 on 386 degrees of freedom Multiple R-Squared: 0.9811, Adjusted R-squared: 0.9781

F-statistic: 328.7 on 61 and 386 DF, p-value: < 2.2e-16

Estimation results for equation stock ts:

 $stock_ts = oil_ts.l1 + stock_ts.l1 + job_ts.l1 + cpi_ts.l1 + frr_ts.l1 + oil_ts.l2 + s\\ tock_ts.l2 + job_ts.l2 + cpi_ts.l2 + frr_ts.l2 + oil_ts.l3 + stock_ts.l3 + job_ts.l3 +\\ cpi_ts.l3 + frr_ts.l3 + oil_ts.l4 + stock_ts.l4 + job_ts.l4 + cpi_ts.l4 + frr_ts.l4 + oil_ts.l5 + stock_ts.l5 + job_ts.l5 + cpi_ts.l5 + frr_ts.l5 + oil_ts.l6 + stock_ts.l6 + job_ts.l6 + cpi_ts.l6 + frr_ts.l6 + oil_ts.l7 + stock_ts.l7 + job_ts.l7 + cpi_ts.l7 + frr_ts.l7 + oil_ts.l8 + stock_ts.l8 + job_ts.l8 + cpi_ts.l8 + frr_ts.l8 + oil_ts.l9 + stock_ts.l9 + job_ts.l9 + cpi_ts.l9 + frr_ts.l9 + oil_ts.l10 + stock_ts.l10 + job_ts.l10 + cpi_ts.l10 + oil_ts.l11 + stock_ts.l11 + job_ts.l11 + cpi_ts.l11 + frr_ts.l11 + oil_ts.l12 + stock_ts.l12 + job_ts.l12 + cpi_ts.l12 + frr_ts.l12 + const + trend$

6.539e-01 2.661e+00 0.246 0.806029 oil ts.l1 stock ts.l1 1.091e+00 5.122e-02 21.295 < 2e-16 *** job ts.l1 -1.154e-02 1.380e-02 -0.836 0.403545 cpi ts.l1 -1.610e+02 6.077e+01 -2.649 0.008398 ** frr ts.l1 -3.096e+01 7.840e+01 -0.395 0.693158 oil ts.l2 -6.890e-01 4.315e+00 -0.160 0.873232 stock ts.l2 -1.982e-01 7.898e-02 -2.509 0.012514 * job ts.l2 -2.014e-02 1.903e-02 -1.058 0.290652 3.659e+02 9.500e+01 3.852 0.000137 *** cpi ts.l2 2.452e+01 1.365e+02 0.180 0.857482 frr ts.l2 oil ts.l3 -3.659e+00 4.387e+00 -0.834 0.404728 stock ts.l3 2.220e-02 8.523e-02 0.260 0.794619 job ts.l3 1.769e-03 1.914e-02 0.092 0.926398 cpi ts.l3 -2.321e+02 9.916e+01 -2.340 0.019777 * frr ts.l3 5.290e+01 1.324e+02 0.400 0.689736

oil ts.l4 -3.083e+00 4.395e+00 -0.701 0.483462

Estimate Std. Error t value Pr(>|t|)

stock ts.l4 6.633e-02 8.686e-02 0.764 0.445565 -3.609e-02 1.897e-02 -1.903 0.057820 . job ts.l4 -1.654e+01 9.951e+01 -0.166 0.868115 cpi ts.l4 frr ts.l4 4.270e+01 1.279e+02 0.334 0.738706 1.360e+01 4.393e+00 3.096 0.002103 ** oil ts.l5 stock ts.I5 7.611e-02 8.758e-02 0.869 0.385374 job ts.l5 6.335e-02 1.904e-02 3.328 0.000959 *** cpi ts.l5 1.096e+02 9.919e+01 1.105 0.269953 frr ts.l5 -6.056e+00 1.282e+02 -0.047 0.962335 oil ts.l6 -9.814e+00 4.446e+00 -2.207 0.027870 * stock ts.l6 -1.038e-01 8.813e-02 -1.178 0.239578 -2.777e-02 1.917e-02 -1.448 0.148331 job ts.l6 cpi ts.l6 -8.096e+01 9.784e+01 -0.827 0.408484 -6.393e+01 1.276e+02 -0.501 0.616520 frr ts.l6 oil ts.I7 -4.603e+00 4.452e+00 -1.034 0.301872 stock ts.I7 1.025e-01 8.756e-02 1.170 0.242551 job ts.l7 2.299e-02 1.907e-02 1.205 0.228858 -7.182e+01 9.857e+01 -0.729 0.466637 cpi ts.17 1.102e+02 1.277e+02 0.863 0.388649 frr ts.I7 oil ts.l8 9.914e-01 4.471e+00 0.222 0.824633 stock ts.l8 -1.135e-01 8.543e-02 -1.328 0.184837 -3.222e-02 1.920e-02 -1.678 0.094183. iob ts.l8 cpi ts.l8 8.387e+01 9.860e+01 0.851 0.395511 -7.355e+01 1.273e+02 -0.578 0.563778 frr ts.l8 9.646e+00 4.464e+00 2.161 0.031321 * oil ts.l9 stock ts.l9 4.917e-03 8.689e-02 0.057 0.954905 3.592e-03 1.946e-02 0.185 0.853659 iob ts.19 cpi ts.l9 -3.312e+01 9.749e+01 -0.340 0.734295 frr ts.I9 -4.861e+01 1.268e+02 -0.383 0.701602 oil ts.l10 -3.179e+00 4.464e+00 -0.712 0.476784 stock ts.I10 1.196e-01 8.831e-02 1.354 0.176588 job ts.l10 8.680e-03 1.925e-02 0.451 0.652336 cpi ts.I10 -2.524e+01 9.424e+01 -0.268 0.788964 frr ts.I10 -9.458e-01 1.272e+02 -0.007 0.994070 oil ts.l11 -2.571e+00 4.376e+00 -0.588 0.557142 stock ts.I11 -1.159e-01 8.772e-02 -1.321 0.187192 job ts.l11 5.039e-02 1.761e-02 2.861 0.004447 ** cpi ts.I11 -6.710e+01 9.213e+01 -0.728 0.466887 frr ts.I11 4.756e+00 1.248e+02 0.038 0.969628 oil ts.l12 -1.905e-01 2.752e+00 -0.069 0.944842 stock ts.l12 2.446e-02 5.939e-02 0.412 0.680713 job ts.l12 -4.498e-02 1.251e-02 -3.595 0.000366 *** frr ts.I12 3.634e+01 7.341e+01 0.495 0.620844 const 1.023e+02 3.982e+02 0.257 0.797331 -1.851e+00 1.143e+00 -1.619 0.106196 trend

Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 220.5 on 386 degrees of freedom

Multiple R-Squared: 0.9973, Adjusted R-squared: 0.9968

F-statistic: 2317 on 61 and 386 DF, p-value: < 2.2e-16

Estimation results for equation job ts:

job_ts = oil_ts.l1 + stock_ts.l1 + job_ts.l1 + cpi_ts.l1 + frr_ts.l1 + oil_ts.l2 + stock_ts.l2 + job_ts.l2 + cpi_ts.l2 + frr_ts.l2 + oil_ts.l3 + stock_ts.l3 + job_ts.l3 + cpi_ts.l3 + frr_ts.l3 + oil_ts.l4 + stock_ts.l4 + job_ts.l4 + cpi_ts.l4 + frr_ts.l4 + oil_ts.l5 + stock_ts.l5 + job_ts.l5 + cpi_ts.l5 + frr_ts.l5 + oil_ts.l6 + stock_ts.l6 + job_ts.l6 + cpi_ts.l6 + frr_ts.l6 + oil_ts.l7 + stock_ts.l7 + job_ts.l7 + cpi_ts.l7 + fr_ts.l7 + oil_ts.l8 + stock_ts.l8 + job_ts.l8 + cpi_ts.l8 + frr_ts.l8 + oil_ts.l9 + stock_ts.l9 + job_ts.l9 + cpi_ts.l9 + frr_ts.l9 + oil_ts.l10 + stock_ts.l10 + job_ts.l10 + cpi_ts.l10 + frr_ts.l10 + oil_ts.l11 + stock_ts.l11 + job_ts.l11 + cpi_ts.l11 + frr_ts.l11 + oil_ts.l12 + stock_ts.l12 + job_ts.l12 + cpi_ts.l12 + frr_ts.l12 + const + trend

Estimate Std. Error t value Pr(>|t|)

```
3.615e+01 1.065e+01 3.392 0.000764 ***
oil ts.l1
stock ts.l1 1.425e+00 2.051e-01 6.947 1.60e-11 ***
        9.372e-01 5.526e-02 16.959 < 2e-16 ***
job ts.l1
cpi ts.l1
          7.067e+02 2.433e+02 2.904 0.003894 **
         1.536e+03 3.139e+02 4.892 1.47e-06 ***
frr ts.l1
         -3.212e+01 1.728e+01 -1.859 0.063822.
oil ts.l2
stock ts.l2 -1.619e+00 3.163e-01 -5.119 4.84e-07 ***
job_ts.l2 -3.739e-02 7.621e-02 -0.491 0.624010
cpi ts.l2 -1.157e+03 3.804e+02 -3.042 0.002513 **
frr ts.l2
         -2.470e+03 5.464e+02 -4.520 8.24e-06 ***
         4.651e+00 1.756e+01 0.265 0.791292
oil ts.l3
stock ts.l3 -1.004e-01 3.413e-01 -0.294 0.768827
job ts.l3
        9.904e-02 7.662e-02 1.293 0.196921
cpi ts.l3 -1.500e+01 3.971e+02 -0.038 0.969887
frr_ts.l3
         1.090e+03 5.302e+02 2.056 0.040468 *
         -4.641e+00 1.760e+01 -0.264 0.792111
oil ts.l4
stock ts.l4 4.514e-01 3.478e-01 1.298 0.195100
        -3.552e-02 7.595e-02 -0.468 0.640273
job ts.l4
          9.042e+02 3.985e+02 2.269 0.023814 *
cpi ts.l4
frr ts.l4
         -3.777e+02 5.123e+02 -0.737 0.461380
oil ts.l5
         4.110e+00 1.759e+01 0.234 0.815373
stock ts.l5 -3.466e-01 3.507e-01 -0.988 0.323643
          5.197e-04 7.623e-02 0.007 0.994564
job ts.l5
         -3.828e+02 3.972e+02 -0.964 0.335783
cpi ts.l5
frr ts.l5
         5.563e+02 5.132e+02 1.084 0.279057
oil ts.l6
         -6.857e+00 1.780e+01 -0.385 0.700312
stock ts.l6 3.255e-01 3.529e-01 0.922 0.356916
job ts.l6
        -4.828e-03 7.676e-02 -0.063 0.949886
cpi ts.l6
        -7.353e+02 3.918e+02 -1.877 0.061305.
frr ts.l6
        -1.981e+02 5.107e+02 -0.388 0.698323
oil ts.l7
         8.703e+00 1.783e+01 0.488 0.625735
```

```
stock ts.I7 -2.839e-01 3.506e-01 -0.810 0.418655
         -4.729e-02 7.638e-02 -0.619 0.536154
job ts.l7
cpi ts.17
          7.930e+02 3.947e+02 2.009 0.045205 *
         -2.036e+02 5.114e+02 -0.398 0.690788
frr ts.l7
         4.867e+00 1.790e+01 0.272 0.785870
oil ts.l8
stock ts.l8 7.898e-01 3.421e-01 2.309 0.021484 *
         1.932e-01 7.688e-02 2.513 0.012369 *
iob ts.l8
cpi ts.l8 -1.148e+01 3.948e+02 -0.029 0.976809
         4.912e+02 5.097e+02 0.964 0.335797
frr ts.l8
        -1.797e+01 1.787e+01 -1.005 0.315298
oil ts.l9
stock ts.l9 -1.130e+00 3.479e-01 -3.247 0.001267 **
job ts.l9 -7.867e-02 7.793e-02 -1.010 0.313346
cpi ts.l9 -1.579e+02 3.904e+02 -0.404 0.686150
frr ts.l9 -9.581e+02 5.076e+02 -1.888 0.059842.
oil ts.l10 2.021e+01 1.788e+01 1.131 0.258919
stock ts.I10 5.243e-01 3.536e-01 1.483 0.138981
job ts.110 -4.195e-02 7.709e-02 -0.544 0.586642
cpi ts.l10 -1.381e+02 3.773e+02 -0.366 0.714503
frr ts.l10 5.856e+02 5.092e+02 1.150 0.250854
oil ts.l11 -1.905e+01 1.752e+01 -1.087 0.277576
stock ts.I11 2.730e-01 3.512e-01 0.777 0.437511
         1.841e-02 7.052e-02 0.261 0.794229
iob ts.l11
cpi ts.l11 5.719e+02 3.689e+02 1.550 0.121902
frr ts.l11 9.029e+01 4.998e+02 0.181 0.856739
oil ts.l12 4.660e+00 1.102e+01 0.423 0.672612
stock ts.I12 -2.480e-01 2.378e-01 -1.043 0.297709
job ts.l12 -5.959e-03 5.010e-02 -0.119 0.905379
cpi ts.l12 -3.837e+02 2.268e+02 -1.692 0.091507.
frr ts.l12 -1.887e+02 2.939e+02 -0.642 0.521299
const
         1.634e+03 1.595e+03 1.025 0.306071
         -6.568e-01 4.578e+00 -0.143 0.885992
trend
```

Residual standard error: 882.9 on 386 degrees of freedom Multiple R-Squared: 0.9968, Adjusted R-squared: 0.9963

F-statistic: 1957 on 61 and 386 DF, p-value: < 2.2e-16

Estimation results for equation cpi ts:

 $\begin{array}{l} {\rm cpi_ts} = {\rm oil_ts.} \\ 11 + {\rm stock_ts.} \\ 11 + {\rm job_ts.} \\ 12 + {\rm cpi_ts.} \\ 12 + {\rm cpi_ts.} \\ 13 + {\rm stock_ts.} \\ 13 + {\rm job_ts.} \\ 13 + {\rm cpi_ts.} \\ 14 + {\rm cpi_ts.} \\ 15 + {\rm cpi_ts.} \\ 17 + {\rm cpi_ts.} \\ 17 + {\rm cpi_ts.} \\ 18 + {\rm cpi_ts.} \\ 18 + {\rm cpi_ts.} \\ 10 + {\rm cpi_ts.} \\ 10 + {\rm cpi_ts.} \\ 110 + {\rm cpi_ts.} \\ 111 + {\rm c$

Estimate Std. Error t value Pr(>|t|) oil ts.l1 7.639e-03 2.425e-03 3.151 0.00176 ** stock ts.l1 6.534e-05 4.667e-05 1.400 0.16229 1.593e-05 1.258e-05 1.267 0.20607 iob ts.l1 1.239e+00 5.537e-02 22.371 < 2e-16 *** cpi ts.l1 frr ts.l1 6.294e-02 7.144e-02 0.881 0.37886 oil ts.l2 -7.769e-03 3.932e-03 -1.976 0.04889 * stock ts.l2 3.548e-05 7.197e-05 0.493 0.62226 5.801e-06 1.734e-05 0.334 0.73820 job ts.l2 cpi ts.l2 -2.519e-01 8.657e-02 -2.910 0.00382 ** -1.037e-01 1.243e-01 -0.834 0.40493 frr ts.l2 oil ts.l3 -2.616e-04 3.997e-03 -0.065 0.94785 stock ts.l3 -1.682e-04 7.766e-05 -2.165 0.03097 * job ts.l3 -2.926e-05 1.744e-05 -1.678 0.09408. cpi ts.l3 -1.446e-01 9.036e-02 -1.600 0.11032 -7.419e-03 1.206e-01 -0.061 0.95099 frr ts.l3 oil ts.l4 4.059e-03 4.004e-03 1.014 0.31136 stock ts.l4 -2.741e-06 7.915e-05 -0.035 0.97239 7.944e-06 1.728e-05 0.460 0.64604 iob ts.l4 cpi ts.l4 9.484e-02 9.067e-02 1.046 0.29625 9.979e-02 1.166e-01 0.856 0.39250 frr ts.l4 -1.640e-03 4.003e-03 -0.410 0.68218 oil ts.l5 stock ts.l5 1.122e-04 7.980e-05 1.406 0.16063 3.730e-06 1.735e-05 0.215 0.82986 job ts.l5 1.329e-01 9.038e-02 1.471 0.14210 cpi ts.l5 frr ts.l5 -2.797e-02 1.168e-01 -0.240 0.81081 oil ts.l6 -2.420e-03 4.051e-03 -0.597 0.55066 stock ts.l6 6.455e-05 8.030e-05 0.804 0.42197 6.866e-06 1.747e-05 0.393 0.69448 job ts.l6 5.488e-02 8.915e-02 0.616 0.53853 cpi ts.l6 frr ts.l6 -8.081e-02 1.162e-01 -0.695 0.48730 oil ts.l7 -2.173e-04 4.057e-03 -0.054 0.95731 stock ts.l7 -1.568e-04 7.978e-05 -1.966 0.05003. -4.074e-05 1.738e-05 -2.344 0.01958 * job ts.l7 cpi ts.17 -3.812e-02 8.981e-02 -0.424 0.67147 frr ts.I7 2.244e-02 1.164e-01 0.193 0.84719 1.527e-03 4.074e-03 0.375 0.70795 oil_ts.l8 stock ts.l8 1.456e-04 7.784e-05 1.870 0.06225. 3.210e-05 1.750e-05 1.835 0.06729. job ts.l8 3.484e-02 8.985e-02 0.388 0.69841 cpi ts.l8 frr ts.18 1.368e-01 1.160e-01 1.180 0.23890 oil ts.19 -6.896e-04 4.067e-03 -0.170 0.86545 stock ts.l9 2.117e-05 7.917e-05 0.267 0.78934 job ts.l9 2.385e-05 1.773e-05 1.345 0.17948 cpi ts.l9 -1.108e-01 8.884e-02 -1.247 0.21321 frr ts.l9 -2.015e-01 1.155e-01 -1.744 0.08188.

```
stock ts.l10 6.200e-05 8.046e-05 0.771 0.44145
          1.462e-05 1.754e-05 0.834 0.40496
job ts.l10
frr ts.l10 8.964e-02 1.159e-01 0.774 0.43963
oil ts.l11 -5.379e-04 3.987e-03 -0.135 0.89275
stock ts.I11 -1.921e-04 7.993e-05 -2.403 0.01672 *
job ts.l11 -7.840e-06 1.605e-05 -0.489 0.62542
cpi ts.l11 8.268e-03 8.395e-02 0.098 0.92159
frr ts.l11 -7.140e-02 1.137e-01 -0.628 0.53055
oil ts.l12 6.042e-05 2.507e-03 0.024 0.98079
stock ts.l12 7.460e-05 5.411e-05 1.379 0.16882
job ts.l12 -3.748e-05 1.140e-05 -3.288 0.00110 **
cpi ts.l12 -4.207e-02 5.162e-02 -0.815 0.41559
frr ts.I12 7.858e-02 6.689e-02 1.175 0.24082
         1.473e+00 3.628e-01 4.060 5.95e-05 ***
const
trend
         1.845e-03 1.042e-03 1.771 0.07732.
```

Residual standard error: 0.2009 on 386 degrees of freedom

Multiple R-Squared: 1, Adjusted R-squared: 1

F-statistic: 4.537e+05 on 61 and 386 DF, p-value: < 2.2e-16

Estimation results for equation frr_ts:

frr_ts = oil_ts.l1 + stock_ts.l1 + job_ts.l1 + cpi_ts.l1 + frr_ts.l1 + oil_ts.l2 + stock_ts.l2 + job_ts.l2 + cpi_ts.l2 + frr_ts.l2 + oil_ts.l3 + stock_ts.l3 + job_ts.l3 + cpi_ts.l3 + frr_ts.l3 + oil_ts.l4 + stock_ts.l4 + job_ts.l4 + cpi_ts.l4 + frr_ts.l4 + oil_ts.l5 + stock_ts.l5 + job_ts.l5 + cpi_ts.l5 + frr_ts.l5 + oil_ts.l6 + stock_ts.l6 + job_ts.l6 + cpi_ts.l6 + frr_ts.l6 + oil_ts.l7 + stock_ts.l7 + job_ts.l7 + cpi_ts.l7 + frr_ts.l7 + oil_ts.l8 + stock_ts.l8 + job_ts.l8 + cpi_ts.l8 + frr_ts.l8 + oil_ts.l9 + stock_ts.l9 + job_ts.l9 + cpi_ts.l9 + frr_ts.l9 + oil_ts.l10 + stock_ts.l10 + job_ts.l11 + frr_ts.l10 + oil_ts.l11 + stock_ts.l11 + job_ts.l11 + cpi_ts.l11 + frr_ts.l11 + oil_ts.l12 + stock_ts.l12 + job_ts.l12 + cpi_ts.l12 + frr_ts.l12 + const + trend

Estimate Std. Error t value Pr(>|t|) oil_ts.l1 1.252e-03 1.774e-03 0.705 0.4809 stock_ts.l1 2.894e-05 3.415e-05 0.847 0.3973 job_ts.l1 -1.237e-05 9.203e-06 -1.344 0.1797 cpi_ts.l1 -6.543e-02 4.052e-02 -1.615 0.1072 frr_ts.l1 1.432e+00 5.228e-02 27.395 < 2e-16 *** oil_ts.l2 2.487e-03 2.878e-03 0.864 0.3880 stock_ts.l2 -3.063e-05 5.267e-05 -0.582 0.5612 job_ts.l2 -3.618e-07 1.269e-05 -0.029 0.9773 cpi_ts.l2 1.087e-01 6.335e-02 1.716 0.0870 frr_ts.l2 -3.961e-01 9.100e-02 -4.352 1.73e-05 *** oil_ts.l3 -4.926e-03 2.925e-03 -1.684 0.0930 .

stock ts.l3 6.712e-05 5.683e-05 1.181 0.2383 2.482e-05 1.276e-05 1.945 0.0525. job ts.l3 cpi ts.l3 -8.200e-02 6.612e-02 -1.240 0.2157 frr ts.l3 6.790e-02 8.829e-02 0.769 0.4423 oil ts.l4 -1.608e-03 2.931e-03 -0.549 0.5834 stock ts.l4 -1.129e-04 5.792e-05 -1.949 0.0520. job ts.l4 -4.282e-06 1.265e-05 -0.339 0.7351 cpi ts.l4 -3.390e-02 6.636e-02 -0.511 0.6097 frr ts.l4 -1.033e-01 8.531e-02 -1.211 0.2266 oil ts.15 2.984e-03 2.929e-03 1.018 0.3091 stock ts.l5 1.718e-06 5.840e-05 0.029 0.9765 -7.148e-06 1.269e-05 -0.563 0.5737 job ts.l5 cpi ts.l5 1.105e-01 6.614e-02 1.670 0.0957. frr ts.l5 9.665e-02 8.547e-02 1.131 0.2588 oil ts.l6 -1.368e-03 2.965e-03 -0.461 0.6447 stock ts.l6 7.855e-05 5.877e-05 1.337 0.1821 job ts.l6 -8.054e-08 1.278e-05 -0.006 0.9950 1.741e-02 6.524e-02 0.267 0.7897 cpi ts.l6 -1.118e-01 8.505e-02 -1.315 0.1894 frr ts.l6 oil ts.l7 1.188e-03 2.969e-03 0.400 0.6894 stock ts.I7 -1.600e-05 5.839e-05 -0.274 0.7841 iob ts.17 1.900e-06 1.272e-05 0.149 0.8813 cpi ts.l7 -9.872e-02 6.573e-02 -1.502 0.1339 frr ts.17 -5.653e-02 8.517e-02 -0.664 0.5072 -6.460e-04 2.981e-03 -0.217 0.8286 oil ts.l8 stock ts.l8 -4.297e-05 5.697e-05 -0.754 0.4511 job_ts.l8 -2.093e-05 1.280e-05 -1.635 0.1030 8.124e-02 6.575e-02 1.236 0.2174 cpi ts.l8 frr ts.18 1.086e-01 8.489e-02 1.279 0.2017 4.376e-03 2.977e-03 1.470 0.1423 oil ts.l9 stock ts.l9 1.039e-04 5.794e-05 1.794 0.0736. 1.944e-05 1.298e-05 1.498 0.1349 job ts.l9 cpi ts.l9 -2.033e-02 6.501e-02 -0.313 0.7546 frr ts.l9 7.090e-02 8.454e-02 0.839 0.4022 oil ts.l10 -2.889e-03 2.977e-03 -0.970 0.3325 stock ts.l10 -3.019e-05 5.888e-05 -0.513 0.6085 cpi ts.l10 -2.592e-02 6.284e-02 -0.412 0.6803 frr ts.I10 -2.032e-01 8.480e-02 -2.396 0.0171 * oil ts.I11 -2.969e-03 2.918e-03 -1.018 0.3095 stock ts.l11 -4.977e-05 5.849e-05 -0.851 0.3953 job ts.l11 -3.599e-06 1.174e-05 -0.306 0.7594 cpi ts.l11 4.335e-02 6.143e-02 0.706 0.4809 frr ts.l11 3.822e-02 8.323e-02 0.459 0.6464 stock ts.l12 2.171e-05 3.960e-05 0.548 0.5839 job ts.l12 -7.526e-06 8.343e-06 -0.902 0.3676 cpi ts.l12 -3.584e-02 3.777e-02 -0.949 0.3433 1.973e-01 2.655e-01 0.743 0.4580 const

trend -6.370e-04 7.623e-04 -0.836 0.4039

Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 0.147 on 386 degrees of freedom Multiple R-Squared: 0.9974, Adjusted R-squared: 0.997

F-statistic: 2403 on 61 and 386 DF, p-value: < 2.2e-16

Covariance matrix of residuals:

oil_ts stock_ts job_ts cpi_ts frr_ts
oil_ts 19.0559 108.204 518.43 0.183590 0.131333
stock_ts 108.2039 48616.699 -8267.33 3.869161 4.965761
job_ts 518.4349 -8267.335 779486.06 69.249577 16.580613
cpi_ts 0.1836 3.869 69.25 0.040364 0.002645
frr ts 0.1313 4.966 16.58 0.002645 0.021618

Correlation matrix of residuals:

oil_ts stock_ts job_ts cpi_ts frr_ts oil_ts 1.0000 0.11242 0.13452 0.20933 0.20462 stock_ts 0.1124 1.00000 -0.04247 0.08734 0.15318 job_ts 0.1345 -0.04247 1.00000 0.39040 0.12773 cpi_ts 0.2093 0.08734 0.39040 1.00000 0.08954 frr ts 0.2046 0.15318 0.12773 0.08954 1.00000

> summary(var_growth)

VAR Estimation Results:

Endogenous variables: oil_g, stock_g, job_g, cpi_g, frr_g

Deterministic variables: const

Sample size: 448

Log Likelihood: 5710.507

Roots of the characteristic polynomial:

 $\begin{array}{c} 0.9689\ 0.9059\ 0.9059\ 0.9001\ 0.8974\ 0.8974\ 0.8933\ 0.8933\ 0.8931\ 0.8931\ 0.\\ 8907\ 0.8907\ 0.8891\ 0.8891\ 0.8855\ 0.8855\ 0.8816\ 0.8816\ 0.8779\ 0.8779\ 0.85\\ 8\ 0.858\ 0.8568\ 0.8568\ 0.8534\ 0.8534\ 0.8452\ 0.8452\ 0.8445\ 0.8445\ 0.8445\ 0.8415\ 0.\\ 8415\ 0.835\ 0.835\ 0.8336\ 0.8336\ 0.833\ 0.8299\ 0.8299\ 0.8136\ 0.8136\ 0.\\ 8088\ 0.8088\ 0.8087\ 0.8087\ 0.7993\ 0.7993\ 0.7901\ 0.7901\ 0.7304\ 0.7304\ 0.72\\ 04\ 0.7204\ 0.7067\ 0.6808\ 0.6808\ 0.5393\ 0.1515 \end{array}$

Call:

VAR(y = data11, p = lag_length, type = "const")

Estimation results for equation oil g:

 $\begin{array}{l} \text{oil_g = oil_g.l1 + stock_g.l1 + job_g.l1 + cpi_g.l1 + frr_g.l1 + oil_g.l2 + stock_g.l2 + job_g.l2 + cpi_g.l2 + frr_g.l2 + oil_g.l3 + stock_g.l3 + job_g.l3 + cpi_g.l3 + frr_g.l3 + oil_g.l4 + stock_g.l4 + job_g.l4 + cpi_g.l4 + frr_g.l4 + oil_g.l5 + stock_g.l5 + job_g.l5 + cpi_g.l5 + frr_g.l5 + oil_g.l6 + stock_g.l6 + job_g.l6 + cpi_g.l6 + frr_g.l6 + oil_g.l7 + stock_g.l7 + job_g.l7 + cpi_g.l7 + frr_g.l7 + oil_g.l8 + stock_g.l8 + job_g.l8 + cpi_g.l8 + frr_g.l8 + oil_g.l9 + stock_g.l9 + job_g.l9 + cpi_g.l9 + frr_g.l9 + oil_g.l10 + stock_g.l10 + job_g.l10 + cpi_g.l10 + frr_g.l10 + oil_g.l11 + stock_g.l11 + job_g.l11 + cpi_g.l11 + frr_g.l11 + oil_g.l12 + stock_g.l12 + cpi_g.l12 + frr_g.l12 + const \\ \end{array}$

Estimate Std. Error t value Pr(>|t|) 0.340191 0.055428 6.138 2.08e-09 *** oil g.l1 stock g.l1 -0.024968 0.089031 -0.280 0.7793 job g.l1 7.871696 4.735613 1.662 0.0973. cpi g.l1 0.051044 0.030971 1.648 0.1001 frr g.l1 oil g.l2 stock a.l2 0.264838 0.094869 2.792 0.0055 ** -0.849283 0.771822 -1.100 0.2719 iob q.l2 cpi g.l2 1.677012 4.836791 0.347 0.7290 -0.002154 0.033779 -0.064 0.9492 frr g.l2 oil g.l3 -0.027629 0.058019 -0.476 0.6342 stock g.l3 -0.058179 0.095714 -0.608 0.5437 job g.l3 -0.825865 0.778768 -1.060 0.2896 2.569690 4.808399 0.534 0.5934 cpi g.l3 frr g.l3 -0.038135 0.031784 -1.200 0.2309 -0.094651 0.057950 -1.633 0.1032 oil g.l4 stock g.l4 0.117270 0.096416 1.216 0.2246 iob q.l4 -0.032900 0.776019 -0.042 0.9662 cpi g.l4 2.039584 4.773807 0.427 0.6694 0.037098 0.032009 1.159 0.2472 frr g.l4 0.001801 0.057990 0.031 0.9752 oil g.l5 stock g.I5 -0.102512 0.095865 -1.069 0.2856 job g.l5 -0.085630 0.776422 -0.110 0.9122 1.897695 4.731360 0.401 0.6886 cpi g.l5 frr g.l5 -0.022358 0.032003 -0.699 0.4852 -0.078622 0.058058 -1.354 0.1765 oil g.l6 stock g.l6 0.074278 0.094906 0.783 0.4343 job_g.l6 0.112169 0.774708 0.145 0.8850 -1.599344 4.699495 -0.340 0.7338 cpi_g.l6 0.019249 0.032029 0.601 0.5482 frr q.l6 oil g.l7 -0.004140 0.057360 -0.072 0.9425 stock g.l7 0.083818 0.094656 0.885 0.3764 job g.l7 -0.616407 0.761348 -0.810 0.4187 -2.039714 4.745160 -0.430 0.6675 cpi g.l7 frr g.l7 -0.011716 0.032090 -0.365 0.7152 -0.037990 0.056911 -0.668 0.5048 oil g.l8 stock g.l8 0.063415 0.094832 0.669 0.5041 job g.l8 -0.669309 0.748344 -0.894 0.3717 cpi g.l8 -3.526489 4.739021 -0.744 0.4572

frr g.l8 0.047322 0.031487 1.503 0.1337 oil g.l9 -0.020353 0.056947 -0.357 0.7210 stock g.l9 0.110306 0.095403 1.156 0.2483 job g.l9 -0.596607 0.750600 -0.795 0.4272 cpi g.l9 -0.030605 4.770198 -0.006 0.9949 -0.008602 0.031646 -0.272 0.7859 frr g.l9 oil q.l10 0.067704 0.057025 1.187 0.2359 stock g.l10 -0.056193 0.095870 -0.586 0.5581 job g.l10 -1.208069 0.757873 -1.594 0.1117 cpi q.l10 -1.576770 4.655673 -0.339 0.7350 frr g.l10 0.014537 0.031419 0.463 0.6439 0.048058 0.055986 0.858 0.3912 oil g.l11 stock g.l11 0.111759 0.095620 1.169 0.2432 job g.l11 0.037758 0.753019 0.050 0.9600 cpi g.l11 -2.397285 4.648122 -0.516 0.6063 frr g.l11 -0.017256 0.031503 -0.548 0.5842 oil g.l12 -0.040547 0.053274 -0.761 0.4471 stock a.l12 -0.104881 0.090777 -1.155 0.2487 job q.l12 0.300692 0.708735 0.424 0.6716 cpi g.l12 -1.870721 4.479692 -0.418 0.6765 frr g.l12 0.007990 0.028866 0.277 0.7821 const 0.002434 0.011343 0.215 0.8302

Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 0.08674 on 387 degrees of freedom Multiple R-Squared: 0.2711, Adjusted R-squared: 0.158

F-statistic: 2.398 on 60 and 387 DF, p-value: 3.182e-07

Estimation results for equation stock g:

 $stock_g = oil_g.l1 + stock_g.l1 + job_g.l1 + cpi_g.l1 + frr_g.l1 + oil_g.l2 + stock_g.l2 + job_g.l2 + cpi_g.l2 + frr_g.l2 + oil_g.l3 + stock_g.l3 + job_g.l3 + cpi_g.l3 + frr_g.l3 + oil_g.l4 + stock_g.l4 + job_g.l4 + cpi_g.l4 + frr_g.l4 + oil_g.l5 + stock_g.l5 + job_g.l5 + cpi_g.l5 + frr_g.l5 + oil_g.l6 + stock_g.l6 + job_g.l6 + cpi_g.l6 + frr_g.l6 + oil_g.l7 + stock_g.l7 + job_g.l7 + cpi_g.l7 + frr_g.l7 + oil_g.l8 + stock_g.l8 + job_g.l8 + cpi_g.l8 + frr_g.l8 + oil_g.l9 + stock_g.l9 + job_g.l9 + cpi_g.l9 + frr_g.l9 + oil_g.l10 + stock_g.l10 + job_g.l10 + cpi_g.l10 + frr_g.l10 + oil_g.l11 + stock_g.l11 + job_g.l11 + cpi_g.l11 + frr_g.l11 + oil_g.l12 + stock_g.l12 + job_g.l12 + cpi_g.l12 + const$

Estimate Std. Error t value Pr(>|t|)
oil_g.l1 -0.022333 0.031829 -0.702 0.48332
stock_g.l1 0.322098 0.051126 6.300 8.1e-10 ***
job_g.l1 0.218535 0.408797 0.535 0.59325
cpi_g.l1 -4.425450 2.719432 -1.627 0.10448
frr_g.l1 -0.015977 0.017785 -0.898 0.36955
oil g.l2 -0.001906 0.033435 -0.057 0.95456

stock g.l2 -0.061679 0.054479 -1.132 0.25827 -0.435110 0.443220 -0.982 0.32686 job g.l2 2.131230 2.777534 0.767 0.44337 cpi g.l2 frr g.l2 -0.017383 0.019398 -0.896 0.37074 0.017018 0.033318 0.511 0.60980 oil g.l3 stock g.l3 0.001324 0.054964 0.024 0.98080 job g.l3 -0.316010 0.447209 -0.707 0.48022 0.643873 2.761230 0.233 0.81574 cpi g.l3 frr g.l3 0.012080 0.018252 0.662 0.50848 oil_g.l4 -0.037259 0.033278 -1.120 0.26357 stock g.l4 -0.027945 0.055367 -0.505 0.61403 job g.l4 -0.741132 0.445630 -1.663 0.09710. cpi g.l4 -0.665315 2.741365 -0.243 0.80837 frr g.l4 oil g.l5 stock g.l5 0.039714 0.055050 0.721 0.47110 job_g.l5 0.322886 0.445861 0.724 0.46939 -0.609276 2.716990 -0.224 0.82268 cpi g.l5 0.027386 0.018378 1.490 0.13700 frr g.l5 oil g.l6 0.010068 0.033340 0.302 0.76283 stock g.l6 -0.002855 0.054500 -0.052 0.95824 job g.l6 -0.040556 0.444877 -0.091 0.92741 1.049540 2.698692 0.389 0.69756 cpi g.l6 frr g.l6 -0.047973 0.018393 -2.608 0.00945 ** oil g.l7 -0.049559 0.032939 -1.505 0.13325 stock g.l7 0.015531 0.054356 0.286 0.77525 job g.l7 0.007435 0.437205 0.017 0.98644 cpi g.l7 -3.902468 2.724915 -1.432 0.15291 frr q.17 0.026958 0.018428 1.463 0.14431 oil g.l8 -0.051913 0.032681 -1.588 0.11300 stock g.l8 0.050641 0.054457 0.930 0.35299 job g.l8 -0.525659 0.429737 -1.223 0.22199 4.131616 2.721389 1.518 0.12978 cpi g.l8 0.026614 0.018082 1.472 0.14186 frr g.l8 oil g.l9 0.036566 0.032702 1.118 0.26419 stock g.l9 -0.057194 0.054785 -1.044 0.29715 job g.l9 -0.591720 0.431033 -1.373 0.17061 cpi g.l9 -1.566991 2.739293 -0.572 0.56763 frr g.l9 0.008708 0.018173 0.479 0.63208 oil g.l10 -0.001177 0.032747 -0.036 0.97135 stock g.l10 0.101570 0.055054 1.845 0.06581. iob g.l10 0.107603 0.435210 0.247 0.80485 cpi g.l10 -2.603033 2.673527 -0.974 0.33085 frr_g.l10 -0.001847 0.018042 -0.102 0.91849 oil g.l11 -0.048163 0.032150 -1.498 0.13494 stock g.l11 0.038224 0.054910 0.696 0.48677 job g.l11 0.731820 0.432422 1.692 0.09138. cpi g.l11 3.495587 2.669191 1.310 0.19111 frr g.l11 -0.034990 0.018090 -1.934 0.05382. oil g.l12 -0.043404 0.030592 -1.419 0.15677

Residual standard error: 0.04981 on 387 degrees of freedom Multiple R-Squared: 0.2286, Adjusted R-squared: 0.109

F-statistic: 1.911 on 60 and 387 DF, p-value: 0.0001545

Estimation results for equation job g:

job_g = oil_g.l1 + stock_g.l1 + job_g.l1 + cpi_g.l1 + frr_g.l1 + oil_g.l2 + stock_g.l2 + job_g.l2 + cpi_g.l2 + frr_g.l2 + oil_g.l3 + stock_g.l3 + job_g.l3 + cpi_g.l3 + frr_g.l3 + oil_g.l4 + stock_g.l4 + job_g.l4 + cpi_g.l4 + frr_g.l4 + oil_g.l5 + stock_g.l5 + job_g.l5 + cpi_g.l5 + frr_g.l5 + oil_g.l6 + stock_g.l6 + job_g.l6 + cpi_g.l6 + frr_g.l6 + oil_g.l7 + stock_g.l7 + job_g.l7 + cpi_g.l7 + frr_g.l7 + oil_g.l8 + stock_g.l8 + job_g.l8 + cpi_g.l8 + frr_g.l8 + oil_g.l9 + stock_g.l9 + job_g.l9 + cpi_g.l9 + frr_g.l9 + oil_g.l10 + stock_g.l10 + job_g.l10 + cpi_g.l10 + frr_g.l10 + oil_g.l11 + stock_g.l11 + job_g.l11 + cpi_g.l11 + frr_g.l11 + oil_g.l12 + stock_g.l12 + job_g.l12 + cpi_g.l12 + frr_g.l12 + const

Estimate Std. Error t value Pr(>|t|)

```
0.0192494 0.0042720 4.506 8.76e-06 ***
oil g.l1
stock g.l1 0.0229520 0.0068619 3.345 0.000904 ***
        -0.1266463 0.0548668 -2.308 0.021512 *
job g.l1
         0.9680082 0.3649895 2.652 0.008327 **
cpi g.l1
         0.0133298 0.0023870 5.584 4.43e-08 ***
frr g.l1
oil g.l2
         0.0019948 0.0044875 0.445 0.656904
stock g.l2 -0.0076375 0.0073119 -1.045 0.296892
job g.l2 -0.1085334 0.0594869 -1.824 0.068848.
cpi g.l2
        -0.3462242 0.3727877 -0.929 0.353601
        -0.0073298 0.0026035 -2.815 0.005120 **
frr g.l2
oil_g.l3
         0.0021265 0.0044718 0.476 0.634664
stock g.l3 -0.0066155 0.0073770 -0.897 0.370400
job g.l3 -0.0038410 0.0600223 -0.064 0.949009
cpi q.l3 -0.3184947 0.3705994 -0.859 0.390649
         0.0002345 \ 0.0024497 \ 0.096 \ 0.923795
frr g.l3
        -0.0024220 0.0044664 -0.542 0.587950
oil g.l4
stock g.l4 0.0021612 0.0074311 0.291 0.771338
job g.l4 -0.0303276 0.0598104 -0.507 0.612400
cpi g.l4 0.2960668 0.3679332 0.805 0.421501
frr_g.l4 -0.0018898 0.0024670 -0.766 0.444138
oil g.l5
        0.0016703 0.0044695 0.374 0.708829
stock q.l5 -0.0051731 0.0073886 -0.700 0.484255
job g.l5 -0.0749590 0.0598414 -1.253 0.211098
```

```
0.0853392 0.3646617 0.234 0.815091
cpi g.l5
frr g.l5
        0.0028622 0.0024666 1.160 0.246612
        0.0023867 0.0044747 0.533 0.594088
oil g.l6
stock g.l6 0.0144116 0.0073147 1.970 0.049525 *
job g.l6 -0.0281816 0.0597094 -0.472 0.637207
       -0.5799628 0.3622058 -1.601 0.110149
cpi g.l6
frr g.l6
        0.0004348 0.0024686 0.176 0.860290
oil g.l7
        0.0004485 0.0044209 0.101 0.919240
stock g.l7 -0.0045775 0.0072954 -0.627 0.530734
job_g.l7 -0.0583024 0.0586796 -0.994 0.321053
cpi g.l7 -0.0271597 0.3657254 -0.074 0.940840
       -0.0004196 0.0024733 -0.170 0.865362
frr_g.l7
oil g.l8
       0.0021651 0.0043863 0.494 0.621859
stock g.l8 0.0141318 0.0073090 1.933 0.053907.
       0.0610589 0.0576774 1.059 0.290429
job g.l8
frr g.l8
        0.0045848 0.0024268 1.889 0.059611 .
oil g.l9 -0.0020491 0.0043891 -0.467 0.640863
stock q.l9 -0.0079981 0.0073530 -1.088 0.277389
job g.l9
       0.0450976 0.0578512 0.780 0.436135
cpi g.l9 -0.1880755 0.3676551 -0.512 0.609255
frr g.l9 -0.0050145 0.0024391 -2.056 0.040462 *
oil g.l10 0.0035414 0.0043951 0.806 0.420876
stock g.l10 0.0031490 0.0073891 0.426 0.670221
job g.l10 -0.0045409 0.0584118 -0.078 0.938075
cpi g.l10 -0.2019589 0.3588283 -0.563 0.573877
frr g.l10 -0.0001928 0.0024215 -0.080 0.936571
oil g.l11 0.0005755 0.0043151 0.133 0.893968
stock g.l11 0.0076475 0.0073698 1.038 0.300063
job g.l11 0.0095259 0.0580377 0.164 0.869713
cpi g.l11 0.4758512 0.3582463 1.328 0.184869
frr_g.l11 -0.0004286 0.0024280 -0.177 0.859987
oil a.l12 -0.0064811 0.0041060 -1.578 0.115277
stock g.l12 0.0000550 0.0069965 0.008 0.993731
job g.l12 0.0213639 0.0546246 0.391 0.695936
cpi g.l12 0.0160418 0.3452649 0.046 0.962966
0.0001100 0.0008743 0.126 0.899917
const
```

Residual standard error: 0.006685 on 387 degrees of freedom Multiple R-Squared: 0.296, Adjusted R-squared: 0.1869 F-statistic: 2.712 on 60 and 387 DF, p-value: 4.523e-09

Estimation results for equation cpi_g:

 $\begin{array}{l} {\rm cpi_g = oil_g.l1 + stock_g.l1 + job_g.l1 + cpi_g.l1 + frr_g.l1 + oil_g.l2 + stock_g.l2 + job_g.l2 + cpi_g.l2 + frr_g.l2 + oil_g.l3 + stock_g.l3 + job_g.l3 + cpi_g.l3 + frr_g.l3 + oil_g.l4 + stock_g.l4 + job_g.l4 + cpi_g.l4 + frr_g.l4 + oil_g.l5 + stock_g.l5 + job_g.l5 + cpi_g.l5 + frr_g.l5 + oil_g.l6 + stock_g.l6 + job_g.l6 + cpi_g.l6 + frr_g.l6 + oil_g.l7 + stock_g.l7 + job_g.l7 + cpi_g.l7 + frr_g.l7 + oil_g.l8 + stock_g.l8 + job_g.l8 + cpi_g.l8 + frr_g.l8 + oil_g.l9 + stock_g.l9 + job_g.l9 + cpi_g.l9 + frr_g.l9 + oil_g.l10 + stock_g.l10 + job_g.l10 + cpi_g.l10 + frr_g.l10 + oil_g.l11 + stock_g.l11 + job_g.l11 + cpi_g.l11 + frr_g.l11 + oil_g.l12 + stock_g.l12 + job_g.l12 + cpi_g.l12 + frr_g.l12 + const \\ \end{array}$

Estimate Std. Error t value Pr(>|t|) 1.082e-03 6.254e-04 1.731 0.084327 . oil g.l1 stock g.l1 1.706e-03 1.005e-03 1.699 0.090193. job g.l1 1.406e-02 8.032e-03 1.751 0.080730. 2.483e-01 5.343e-02 4.646 4.64e-06 *** cpi g.l1 5.289e-04 3.494e-04 1.514 0.130923 frr g.l1 oil g.l2 3.097e-04 6.569e-04 0.471 0.637627 stock a.l2 -6.004e-04 1.070e-03 -0.561 0.575192 8.411e-03 8.708e-03 0.966 0.334738 iob q.l2 cpi g.l2 7.414e-02 5.457e-02 1.359 0.175055 -3.226e-04 3.811e-04 -0.846 0.397812 frr g.l2 oil g.l3 -4.370e-04 6.546e-04 -0.668 0.504833 stock g.l3 -7.586e-04 1.080e-03 -0.702 0.482836 -1.274e-02 8.787e-03 -1.449 0.148048 job g.l3 -1.646e-03 5.425e-02 -0.030 0.975818 cpi g.l3 frr g.l3 -2.290e-04 3.586e-04 -0.639 0.523459 3.078e-04 6.538e-04 0.471 0.638072 oil g.l4 stock g.l4 -7.812e-04 1.088e-03 -0.718 0.473145 job q.l4 -1.148e-02 8.756e-03 -1.311 0.190504 cpi g.l4 4.632e-02 5.386e-02 0.860 0.390363 frr g.l4 4.668e-04 3.612e-04 1.292 0.196962 oil g.l5 8.064e-04 6.543e-04 1.233 0.218501 stock g.l5 4.062e-04 1.082e-03 0.376 0.707431 -5.154e-03 8.760e-03 -0.588 0.556631 job g.l5 1.512e-01 5.338e-02 2.832 0.004862 ** cpi g.l5 frr g.l5 -8.681e-05 3.611e-04 -0.240 0.810139 -1.509e-05 6.551e-04 -0.023 0.981635 oil g.l6 stock g.l6 1.610e-03 1.071e-03 1.503 0.133528 job_g.l6 3.331e-03 8.741e-03 0.381 0.703335 1.824e-01 5.302e-02 3.439 0.000647 *** cpi_g.l6 -4.764e-04 3.614e-04 -1.318 0.188165 frr q.l6 oil q.17 -3.358e-04 6.472e-04 -0.519 0.604135 stock g.I7 -1.639e-03 1.068e-03 -1.535 0.125579 job g.l7 -1.234e-02 8.590e-03 -1.436 0.151805 cpi g.l7 1.059e-01 5.354e-02 1.978 0.048627 * frr g.l7 -4.068e-05 3.621e-04 -0.112 0.910591 3.229e-04 6.421e-04 0.503 0.615396 oil g.l8 stock g.l8 1.347e-03 1.070e-03 1.259 0.208857

3.237e-03 8.444e-03 0.383 0.701618

1.317e-01 5.347e-02 2.464 0.014175 *

job g.l8

cpi g.l8

```
frr g.l8
        3.502e-04 3.553e-04 0.986 0.324852
oil g.l9 -1.720e-04 6.425e-04 -0.268 0.789073
stock g.l9 1.238e-03 1.076e-03 1.150 0.250872
        2.190e-02 8.469e-03 2.586 0.010088 *
job g.l9
cpi g.l9 -4.853e-02 5.382e-02 -0.902 0.367797
frr g.l9 -3.981e-04 3.571e-04 -1.115 0.265612
oil q.l10 -2.752e-04 6.434e-04 -0.428 0.669049
stock g.l10 1.041e-03 1.082e-03 0.963 0.336388
job g.l10 1.635e-02 8.551e-03 1.912 0.056570.
frr g.l10 2.229e-04 3.545e-04 0.629 0.529911
oil g.l11 -3.307e-04 6.317e-04 -0.524 0.600901
stock g.l11 -8.697e-04 1.079e-03 -0.806 0.420676
job g.l11 1.264e-02 8.496e-03 1.487 0.137719
cpi g.l11 4.831e-02 5.244e-02 0.921 0.357510
frr g.l11 -2.039e-04 3.554e-04 -0.574 0.566598
oil g.l12 1.082e-03 6.011e-04 1.800 0.072646.
stock a.l12 1.036e-03 1.024e-03 1.011 0.312598
job q.l12 -2.665e-02 7.997e-03 -3.333 0.000942 ***
cpi g.l12 -8.900e-02 5.054e-02 -1.761 0.079046.
frr g.l12 3.797e-06 3.257e-04 0.012 0.990705
const
         2.010e-04 1.280e-04 1.570 0.117140
```

Residual standard error: 0.0009786 on 387 degrees of freedom Multiple R-Squared: 0.5644, Adjusted R-squared: 0.4969

F-statistic: 8.357 on 60 and 387 DF, p-value: < 2.2e-16

Estimation results for equation frr g:

 $\begin{array}{l} & \text{frr_g = oil_g.l1 + stock_g.l1 + job_g.l1 + cpi_g.l1 + frr_g.l1 + oil_g.l2 + stock_g.l2 + job_g.l2 + cpi_g.l2 + frr_g.l2 + oil_g.l3 + stock_g.l3 + job_g.l3 + cpi_g.l3 + frr_g.l3 + oil_g.l4 + stock_g.l4 + job_g.l4 + cpi_g.l4 + frr_g.l4 + oil_g.l5 + stock_g.l5 + job_g.l5 + cpi_g.l5 + frr_g.l5 + oil_g.l6 + stock_g.l6 + job_g.l6 + cpi_g.l6 + frr_g.l6 + oil_g.l7 + stock_g.l7 + job_g.l7 + cpi_g.l7 + frr_g.l7 + oil_g.l8 + stock_g.l8 + job_g.l8 + cpi_g.l8 + frr_g.l8 + oil_g.l9 + stock_g.l9 + job_g.l9 + cpi_g.l9 + frr_g.l9 + oil_g.l10 + stock_g.l10 + job_g.l10 + cpi_g.l10 + frr_g.l10 + oil_g.l11 + stock_g.l11 + job_g.l11 + cpi_g.l11 + frr_g.l11 + oil_g.l12 + stock_g.l11 + job_g.l12 + cpi_g.l12 + frr_g.l12 + const \\ \end{array}$

stock g.l2 0.087204 0.159829 0.546 0.58565 -1.135986 1.300311 -0.874 0.38286 job g.l2 6.953521 8.148687 0.853 0.39400 cpi g.l2 0.072415 0.056908 1.272 0.20397 frr g.l2 -0.096614 0.097747 -0.988 0.32357 oil g.l3 stock g.l3 0.410775 0.161253 2.547 0.01124 * 1.891810 1.312015 1.442 0.15014 job g.l3 -5.600292 8.100853 -0.691 0.48978 cpi g.l3 frr g.l3 0.122090 0.053548 2.280 0.02315 * oil g.l4 -0.138934 0.097631 -1.423 0.15552 stock g.l4 -0.033607 0.162435 -0.207 0.83620 0.907954 1.307382 0.694 0.48780 job_g.l4 cpi g.l4 -14.689367 8.042575 -1.826 0.06855 . frr g.l4 0.039967 0.053926 0.741 0.45905 oil g.l5 -0.057889 0.097697 -0.593 0.55384 stock g.l5 -0.269926 0.161506 -1.671 0.09547. job_g.l5 0.372799 1.308061 0.285 0.77580 16.628021 7.971063 2.086 0.03763 * cpi g.l5 0.137259 0.053917 2.546 0.01129 * frr g.l5 oil g.l6 -0.134094 0.097812 -1.371 0.17119 stock g.l6 0.176996 0.159891 1.107 0.26899 job g.l6 0.505533 1.305174 0.387 0.69872 cpi g.l6 11.337136 7.917380 1.432 0.15297 frr g.l6 0.061030 0.096636 0.632 0.52806 oil g.l7 stock g.l7 -0.035915 0.159469 -0.225 0.82193 -0.373628 1.282665 -0.291 0.77099 job g.l7 -13.376105 7.994313 -1.673 0.09510 . cpi g.l7 frr g.l7 -0.057074 0.054063 -1.056 0.29177 oil_g.l8 -0.064017 0.095880 -0.668 0.50473 stock g.l8 -0.076782 0.159766 -0.481 0.63108 -1.251690 1.260757 -0.993 0.32142 job g.l8 10.854854 7.983970 1.360 0.17475 cpi g.l8 0.047925 0.053048 0.903 0.36686 frr g.l8 0.268118 0.095940 2.795 0.00545 ** oil g.l9 stock g.l9 -0.013300 0.160728 -0.083 0.93409 -0.467707 1.264558 -0.370 0.71169 job g.l9 4.663287 8.036495 0.580 0.56207 cpi g.l9 frr_g.l9 0.072322 0.053315 1.357 0.17573 0.051051 0.096072 0.531 0.59546 oil_g.l10 stock q.I10 0.185018 0.161516 1.146 0.25271 3.029853 1.276812 2.373 0.01813 * job g.l10 cpi g.l10 -10.019338 7.843551 -1.277 0.20223 frr g.l10 -0.121546 0.052932 -2.296 0.02219 * oil g.l11 -0.003976 0.094322 -0.042 0.96640 stock g.l11 -0.262745 0.161095 -1.631 0.10370 job_g.l11 1.175261 1.268634 0.926 0.35482 cpi g.l11 -0.369017 7.830830 -0.047 0.96244 frr g.l11 -0.131670 0.053073 -2.481 0.01353 * oil g.l12 -0.068374 0.089752 -0.762 0.44664

 stock_g.l12
 0.310343
 0.152934
 2.029
 0.04312 *

 job_g.l12
 1.166428
 1.194027
 0.977
 0.32924

 cpi_g.l12
 2.917543
 7.547072
 0.387
 0.69928

 frr_g.l12
 0.057315
 0.048631
 1.179
 0.23930

 const
 -0.016327
 0.019110
 -0.854
 0.39342

Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 0.1461 on 387 degrees of freedom Multiple R-Squared: 0.4988, Adjusted R-squared: 0.4211

F-statistic: 6.42 on 60 and 387 DF, p-value: < 2.2e-16

Covariance matrix of residuals:

oil_g stock_g job_g cpi_g frr_g
oil_g 7.523e-03 5.888e-04 1.583e-04 2.058e-05 3.418e-03
stock_g 5.888e-04 2.481e-03 -2.511e-05 2.098e-06 5.402e-04
job_g 1.583e-04 -2.511e-05 4.469e-05 2.173e-06 1.120e-04
cpi_g 2.058e-05 2.098e-06 2.173e-06 9.578e-07 1.927e-05
frr_g 3.418e-03 5.402e-04 1.120e-04 1.927e-05 2.135e-02

Correlation matrix of residuals:

oil_g stock_g job_g cpi_g frr_g oil_g $1.0000 \ 0.13629 \ 0.2729 \ 0.24248 \ 0.26963$ stock_g $0.1363 \ 1.00000 \ -0.0754 \ 0.04305 \ 0.07421$ job_g $0.2729 \ -0.07540 \ 1.0000 \ 0.33217 \ 0.11467$ cpi_g $0.2425 \ 0.04305 \ 0.3322 \ 1.00000 \ 0.13478$ frr_g $0.2696 \ 0.07421 \ 0.1147 \ 0.13478 \ 1.00000$