#### Discussion

"The Changing Relationship Between Commodity Prices and Prices of Other Assets with Global Market Integration" by Barbara Rossi

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#### IMF-TMB Conference Policy Responses to Commodity Price Movements

Istanbul, April 2012

American Economic Association meetings, 2009

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#### Intriguing result

- Exchange rates of small commodity exporters have forecasting power for global commodity index. True in and out of sample.
- Reverse is not true, i.e. commodity prices do not seem to forecast exchange rates very well (and not out of sample).

#### Conclusions

- Very interesting set of results
- Calls for extensions
- Stock market index has also some forecast ability in and out of sample.
- Seems a slightly noisier predictor than the exchange rate.

### The Data



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### The Sample



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Forecasting Global Commodity Prices (CP) using asset prices of small commodity producers (e.g. New Zealand (NZ))

- Exchange Rate (EXR)
- Equity Prices (**EP**)

This paper (EP)

$$E_t \Delta CP_{t+1} = \alpha + \beta \Delta EP_t^{NZ} + \rho \Delta CP_t$$

Barbara's previous work (EXR):

$$E_t \Delta CP_{t+1} = \alpha + \beta \Delta EXR_t^{NZ} + \rho \Delta CP_t$$

The Naive Benchmark: Random Walk

$$E_t \Delta C P_{t+1} = 0$$

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## The Input



## The Output



## The Output



### The Evaluation: Quadratic Loss



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### The Evaluation: Fluctuation Test



## The empirical finding

## $[\ldots]$ the appearance of the out-of-sample predictive ability of the equity market predictor $[\ldots]$ dated around mid-2000.

Since the mid-2000s marked a large increase in investment in commodity markets, ...

... our empirical evidence suggests a decrease in market segmentation at approximately the same time, ...

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## Summing up

The appearance of predictive ability is not specific to the the equity market predictor!!

Factors other that the decrease in market segmentation and spillovers from equity markets might have been at work!



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# Commodity and Equity Prices at the Time of the Great Recession



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## An Alternative Look at the Data: Modeling Structural Change

Model: Time-Varying Vector Autoregressions (TV-VAR) Cogley and Sargent, 2001, 2005, Primiceri, 2006

$$y_t = A_{0,t} + A_{1,t} y_{t-1} + \varepsilon_t, \quad \varepsilon_t \sim N(0, \Sigma_t)$$
(1)

Parameters evolve according to

Coefficients :  $\theta_t = \theta_{t-1} + \omega_t$ ,  $\omega_t \sim N(0, \Omega)$  (2) Variances :  $\log \sigma_t = \log \sigma_{t-1} + \xi_t$ ,  $\xi_t \sim N(0, \Xi)$  (3) Autocovariance :  $\phi_{t+1} = \phi_{t+1} + \psi_{t+2} + \psi_{t+3} + \omega_t N(0, \Psi_t)$  (4)

 $\psi_{i,t}$ ,  $\xi_t$ ,  $\omega_t$ ,  $\varepsilon_t$  all mutually uncorrelated at all leads and lags.

Reliable Forecasting Tool: D'Agostino, Gambetti and Giannone, 2009. ⇒ Flexible but parsimonious model of structural changes

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## An Alternative Look at the Data: Modeling Structural Change

#### Setting the Prior

$$y_t = A_{0,t} + A_{1,t} y_{t-1} + \varepsilon_t, \quad \varepsilon_t \sim N(0, \Sigma_t)$$
(5)

Parameters evolve according to

$$\theta_t = \theta_{t-1} + \omega_t, \quad \omega_t \sim N(0, \Omega)$$
(6)

Estimate the model by ML over the training sample: 1992-2001  $(\hat{\theta})$ 

$$heta_0 = ilde{ heta} \quad V( heta_0) = V( ilde{ heta})$$

$$\Omega = V( heta_t - heta_{t-1}) = V( ilde{ heta}) imes \lambda^2$$

Quite loose prior to favor time variation:  $\lambda^2 = \frac{1}{10}$ 

Estimation: Gibbs Sampling on entire sample

## An Alternative Look at the Data: Time Varying Coefficients



If anything, Commodity Prices are becoming Less Predictable

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## An Alternative Look at the Data: Stochastic Volatility



Strong comovement in volatility: might be exploited in risk assessment

#### Conclusions

Fascinating, relevant and innovative research agenda

Vey interesting and well executed paper.

I strongly advice you to read it!!