**Research Highlights**

* An extensive benchmark in financial time series forecasting is performed
* Best machine learning(ML) methods out-perform best econometric methods
* The ML methodology employed significantly affects forecasting accuracy
* Market maturity, forecast horizon & model-assessment method affect forecast accuracy
* Evidence against the informational value of technical indicators