## Neural Time Series - Parabootstrap

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The parametric bootstrap is a Monte Carlo type method that uses the nature of neural network, the properties and "shape" of the criterial function  $S(\mathbf{w}) = \mathbf{e}^{T} \mathbf{e}$  (sum of square residuals as a function of the ANN parameter vector w) and, primarily, the instability of the optimal solution. If the parameter w is unknown, the only criterion for a "good" model is minimal  $S(\mathbf{w})$ . However, for a highly non-linear and often somewhat over-determined neural network, it is common that many very different vectors w give very similar minimal prediction error for given data set. So, many different models are "optimal" from the point of view of data fit. They can differ however in predicting for new data (forecasting). It appears that this property can be used to simulate stability, or confidence of prediction and forecast of a time series. This is done by repeated optimization of a ANN-TS (Artificial neural network time series) model with each time randomly generated first estimates of the ANN parameter vector w. From the resulting bunch of optimized models, the statistical parameters of the prediction and forecast is then estimated, assuming normal distribution of the predictions and sufficient complexity of the model to ensure instability of the solution. Though the individual models may differ rather significantly, even as little as 20 or 30 models will have relatively consistent behavior and produce very similar statistical estimates.

## **Data and parameters**

This module uses repeatedly the procedure of the previous model ANN-TS, so its dialog windows are very similar with the same meaning of the input parameters. The difference is in the *Terminating conditions* group where the *Max mean error* specifies the maximum mean error for the optimized model to be included in the final statistical evaluation, user-defined maximum number of iterations per one model and a time limit per one model in seconds. The optimization of every model is terminated if one of the two latter values are reached.

| Neural network time series - ParaBootstrap  |   | Neural network - training   | × |
|---|---|---|---|
| Task name Rates   |   | Task name Rates   |   |
| Columns<br>EUR/USD<br>USD//GBP<br>USD//GBP<br>Data<br>C All<br>C Marked<br>C By filter<br>Elter<br>Vet architecture plot<br>C Label neurons<br>Visualize weights<br>F Rotate plot | Model type        • AR         • Madel depth         • Forecast length         • Validation         • Validation         • Validation         • Validation         • Max mean error         • Unacceptable error         • Max no of iterations         • Max no of iterations         • Time per model (sec) | Mex. error   0.000   0.000   0.000   0.000   0.000   1000   2000   3   No of iterations   1342   Model calculation time [s]   0.0425157254703583   Mean train error   0.00338721791318633   Continue training   Train net |   |
| Save model  | Previous  | Save model ← Previous ⊣> Next   |   |
| <b>? Help</b> 🗎 Apply   | Close 🖉 🖉 🕅   | Phelp Phelp Apply K Close ✓ QK  |   |

Fig. 1 Dialog window for Monte-Carlo ANN-TS forecast user setting and optimization progress



