

08_ARDL

QuantFit Estimator Standard Operating Procedure

SOP: Autoregressive Distributed Lag (ARDL)

Pesaran-Shin-Smith bounds testing approach

=> ARDL handles mixed I(0)/I(1) regressors and yields long-run + short-run dynamics from a single equation.

1. Purpose

ARDL embeds the dependent variable's lags and the regressors' lags in a single equation. Re-parameterising into the unrestricted error correction model (UECM) gives long-run multipliers and the speed of adjustment to equilibrium. The bounds test (Pesaran, Shin, Smith 2001) tests for cointegration without pre-determining the integration order.

2. When to use this estimator

Time-series with mixed I(0)/I(1) regressors (none I(2)).
Need both long-run elasticities and short-run dynamics.
Smaller samples ($T \geq 30$) where Johansen is unreliable.
Single dependent variable framework.

3. Required data structure

Time series with no I(2) variables (run unit-root tests pre-estimation).
T sufficient for AIC-selected lag orders ($T \geq 30$ typical).
Optional dummies for structural breaks identified by Zivot-Andrews.

4. Mathematical formulation

ARDL(p, q₁, ..., q_k) and its UECM re-parameterisation:

$$Y_t = \alpha + \sum_{i=1}^p \beta_i Y_{t-i} + \sum_{j=1}^k \sum_{l=0}^{q_j} \beta_{jl} X_{j,t-l} + \epsilon_t$$

$$\Delta Y_t = \alpha + \phi Y_{t-1} + \sum \theta_j X_{j,t-1} + \sum \beta_i \Delta Y_{t-i} + \sum \beta_{jl} \Delta X_{j,t-l} + \epsilon_t$$

Long-run multiplier: $\lambda_j = -\theta_j / \phi$

$$ECT_{t-1} = Y_{t-1} - \sum \lambda_j X_{j,t-1}$$

5. Pre-estimation diagnostics

Confirm no variable is I(2) - bounds test invalid otherwise.
Stationarity tests (ADF, PP, KPSS, DF-GLS, Ng-Perron).
Zivot-Andrews to detect structural breaks.
VIF for multicollinearity diagnosis.

6. Estimation procedure

Search ARDL(p , q_1 , $?$, q_k) lag combinations up to maxLag.

Select the AIC-minimising combination.

Estimate the UECM by OLS and extract $\phi?$ and $\theta?$.

Compute long-run multipliers via the delta method for SE.

Run the bounds F-test ($k+1$ restrictions on UECM).

Optional CUSUM / CUSUMSQ for parameter stability.

7. Output produced

8. Output interpretation

$\phi? < 0$ and significant \Rightarrow stable error correction; $|\phi?|$ is the fraction of disequilibrium corrected per period.

Half-life of disequilibrium: $\ln(0.5) / \ln(1 + \phi?)$.

λ_j is the long-run elasticity of Y w.r.t. X_j .

Bounds F above the upper bound \Rightarrow cointegration; below the lower bound \Rightarrow no cointegration.

All Card A diagnostics should pass for inference to be valid.

9. Post-estimation diagnostics

Bounds test F and t (Pesaran-Shin-Smith critical values).

Breusch-Godfrey for residual autocorrelation.

Breusch-Pagan / White for heteroskedasticity.

Jarque-Bera for residual normality.

RESET for functional form.

CUSUM / CUSUMSQ for parameter stability.

10. Common pitfalls

If any variable is $I(2)$, the bounds test is invalid.

Positive $\phi?$ indicates explosive dynamics - model is misspecified.

AIC vs BIC can pick different lags; document the choice.

Do not interpret long-run multipliers without confirming bounds-test cointegration.

11. Reporting checklist

Selected ARDL order [p , q_1 , $?$, q_k] and selection criterion.

ECT coefficient with stars and half-life.

Long-run coefficient table with delta-method SE.

Short-run RECM table.

Bounds test F and t with PSS critical values.

Card A diagnostics with verdict.

CUSUM / CUSUMSQ stability comments.

12. References

Pesaran, M. H., Shin, Y., Smith, R. J. (2001). Bounds testing approaches to the analysis of level relationships. *Journal of Applied Econometrics*.

Pesaran, M. H., Shin, Y. (1999). An Autoregressive Distributed Lag Modelling Approach to Cointegration Analysis.

Field | Meaning

ardlOrder | [p, q1, ?, q_k] selected by AIC

ect | phi? - speed of adjustment (must be negative)

ectSE / ectTStat / ectPValue | ECT inference

longRunCoefficients / longRunSE | lambda_j and SE via delta method

shortRunCoefficients | Delta-form coefficients keyed Delta(X), Delta(L(X,1)),

?

boundsTest | F-stat, t-stat, conclusion vs PSS critical values

rSquared / aic / bic | Goodness of fit

diagnostics | Card A: BG, BP, JB, RESET, CUSUM, CUSUMSQ