

9

# Granger Causality

Granger causality means precedence: one TS variable consistently & predictably changes before another does.

Formally:

Two-way/feedback Granger causality requires two corresponding one-way causal rships ( $Z \leftrightarrow Y$ )

$Z$  is Granger causal to  $Y$  ( $Z \rightarrow Y$ ) only if  $y_{t+1}$  can be predicted better when the info. set contains **current/agged**  $Z$ .

cond. f/cast error variance

$$\left\{ \sigma^2(e_{t+1} | \Omega_t) \right\} < \sigma^2(e_{t+1} | \Omega_t - \{Z_{t-i}\})$$

$e = \text{f/cast error}$

denoted as  $Z-Y$

A variable is **instantaneous** Granger causal if  $y_{t+1}$  can be better predicted when the info set contains **current/agged/future**  $Z$ .

$$\sigma^2(e_{t+1} | \Omega_t + Z_{t+1}) < \sigma^2(e_{t+1} | \Omega_t)$$

this is a mutual rship, i.e.  $Z-Y$  implies  $Y-Z$ .

Notes:

1. Granger causality definitions refer to one period ahead. For bi-variate rships this is sufficient, but for multivariate cases it might be insufficient.  $\rightarrow X$  might not cause  $Y_{t+1}$ , but it causes  $Z$  which in turn cause  $Y_{t+2} \rightarrow$  implying a two-period ahead causal rship
2. Granger causality b/w two stationary variables can be tested for in individual eqns. Though VAR models are typically used to test in all directions.
3. Granger causality can depend on data frequency. Daily data probably highly AR unlike annual data.
4. In a multivariate system, a variable is endogenous if the other variables jointly cause it - otherwise it's exogenous

## Testing for Granger causality

Two approaches: F-test or Wald chi-square test on all lags of a variable(s) jointly.

↳  $H_0$ : all lags have zero coefficients,  $H_a$ : some lag(s) has (have) non zero coeffs

↳ The F-test requires normally distributed error terms, but in large samples is equivalent to the Wald test because:

$$\lim_{m_2 \rightarrow \infty} m_1 F \sim \chi^2_{m_1}$$

Tips for interpreting the printout:

→ The final test for each variable ( $Lvar. \leq ALL$ ) indicates the endogeneity of the variable

↳ Either test detail causality amongst specific variables

→ Sometimes the p-values of the F-test and Wald chi-square test will disagree. In this case you need to be cognizant of the F-test requiring normally distributed error terms.

↳ You need to therefore conduct a normality test() on the VAR system.

↳ If the JB test has a sufficiently small p-value, reject  $H_0$  that errors are normally distributed and rely on the Wald chi-square test.