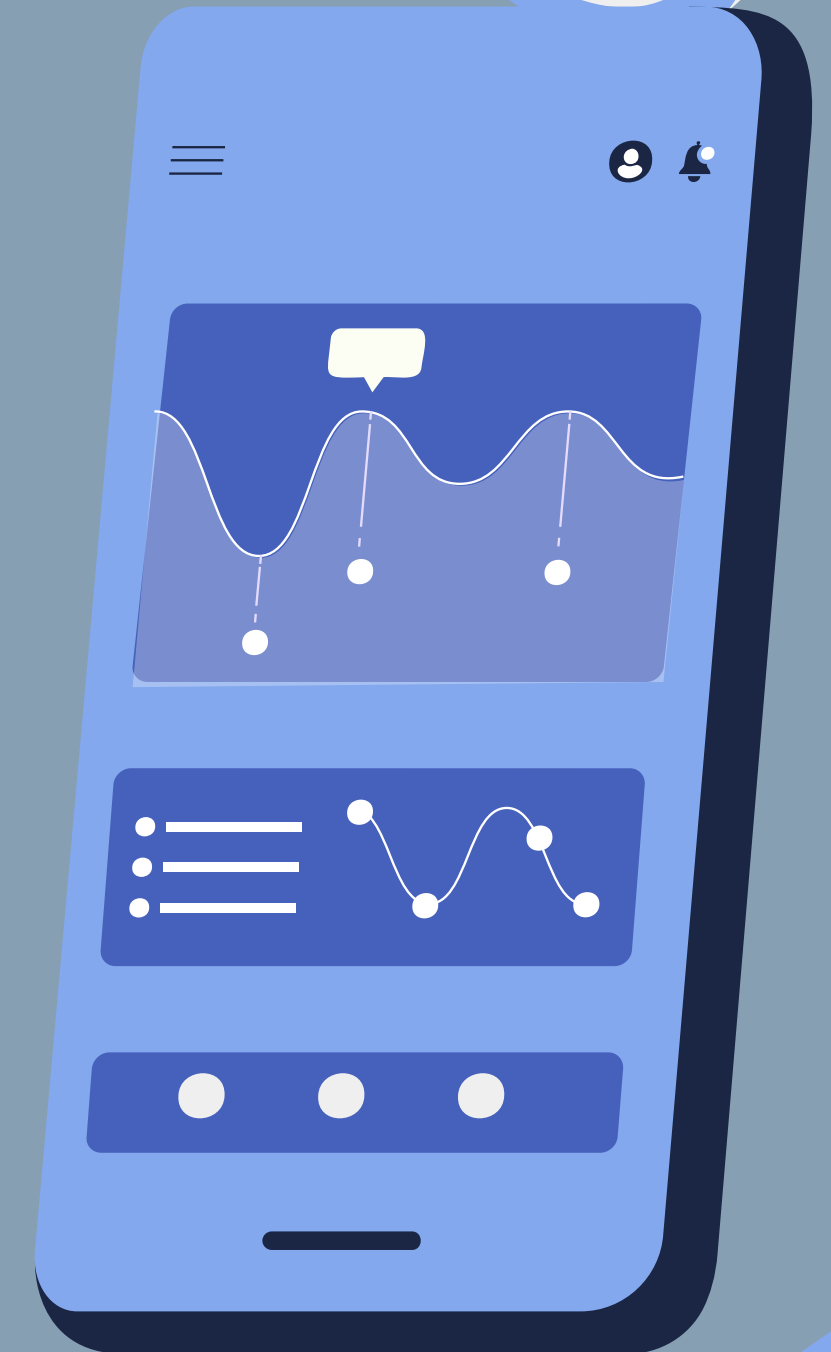


# LAB 8

# VAR FORECASTING



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LEADING AND INSPIRING

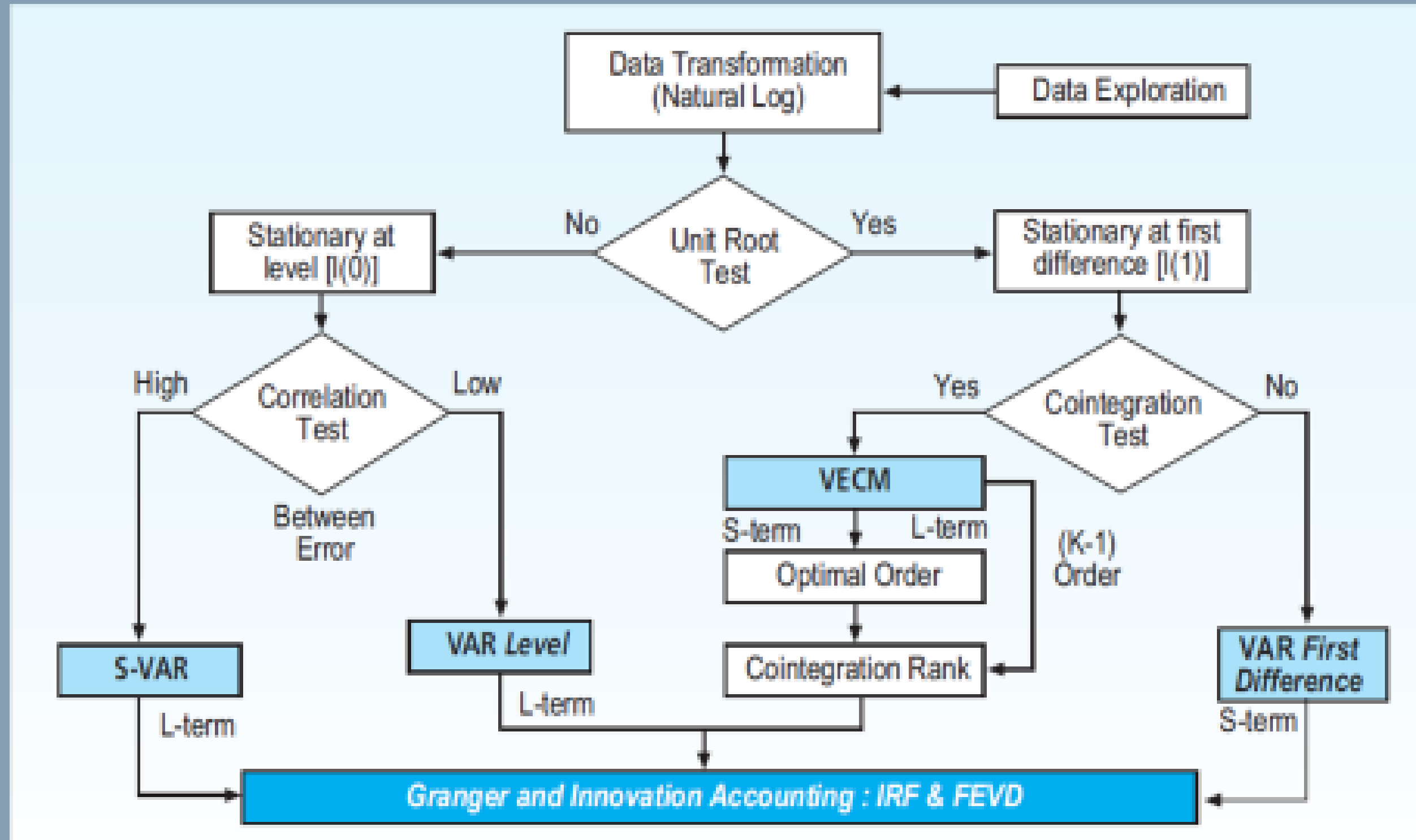


[bit.ly/LAB8TS23](https://bit.ly/LAB8TS23)

# VAR FORECASTING

- VAR (Vector Autoregressive) merupakan model peramalan multivariate yang digunakan untuk menyusun sistem peramalan dari data deret waktu yang saling terkait.
- Penggunaan VAR untuk peramalan ekonomi adalah alternatif dari model persamaan tunggal (univariat) dan model persamaan simultan yang tradisional.
- Keunggulan dari Forecasting VAR adalah memperhitungkan interdependensi antar variabel, sehingga mengurangi masalah akibat misspesifikasi seperti pada model struktural. Berguna ketika teori ekonomi gagal menjelaskan fenomena ekonomi.

# Proses Pembentukan Model VAR



# Tahapan Estimasi VAR



# Penentuan LAG Optimum

Terdapat 2 cara untuk mengujian lag optimum:

- Pre-estimation Command → `varsoc d.varname1 d.varname2`
- Post-estimation Command → `var d.varname1 d.varname2 varsoc`

```
. varsoc
```

Selection-order criteria  
Sample: 1972m4 - 2008m11      Number of obs = 440

| lag | LL       | LR      | df | p     | FPE     | AIC      | HQIC     | SBIC    |
|-----|----------|---------|----|-------|---------|----------|----------|---------|
| 0   | -559.676 |         |    |       | .044039 | 2.55307  | 2.5604   | 2.57165 |
| 1   | -543.575 | 32.201  | 4  | 0.000 | .041682 | 2.49807  | 2.52005  | 2.5538* |
| 2   | -531.612 | 23.927* | 4  | 0.000 | .0402*  | 2.46187* | 2.49851* | 2.55475 |

Endogenous: D.hours D.income  
Exogenous: \_cons

```
. var d.hours d.income, lags(1/2)
```

Vector autoregression

Sample: 1972m4 - 2008m11      No. of obs = 440  
Log likelihood = -531.6118      AIC = 2.461872  
FPE = .0402003      HQIC = 2.498513  
Det(Sigma\_ml) = .0384139      SBIC = 2.554753

| Equation | Parms | RMSE    | R-sq   | chi2     | P>chi2 |
|----------|-------|---------|--------|----------|--------|
| D_hours  | 5     | .400021 | 0.0343 | 15.62982 | 0.0036 |
| D_income | 5     | .500032 | 0.0868 | 41.79808 | 0.0000 |

|          | Coef.     | Std. Err. | z     | P> z  | [95% Conf. Interval] |
|----------|-----------|-----------|-------|-------|----------------------|
| D_hours  |           |           |       |       |                      |
| hours    |           |           |       |       |                      |
| LD.      | -.0532379 | .0475768  | -1.12 | 0.263 | -.1464868 .0400109   |
| L2D.     | .1645273  | .0479031  | 3.43  | 0.001 | .0706389 .2584157    |
| income   |           |           |       |       |                      |
| LD.      | .0037413  | .0382137  | 0.10  | 0.922 | -.0711561 .0786388   |
| L2D.     | .0331609  | .0382789  | 0.87  | 0.386 | -.0418644 .1081861   |
| _cons    | .083112   | .0213592  | 3.89  | 0.000 | .0412486 .1249753    |
| D_income |           |           |       |       |                      |
| hours    |           |           |       |       |                      |
| LD.      | .0434296  | .0594717  | 0.73  | 0.465 | -.0731328 .159992    |
| L2D.     | .0642023  | .0598796  | 1.07  | 0.283 | -.0530796 .1816441   |
| income   |           |           |       |       |                      |
| LD.      | -.2989546 | .0477677  | -6.26 | 0.000 | -.3925775 -.2053317  |
| L2D.     | -.1485468 | .0478491  | -3.10 | 0.002 | -.2423294 -.0547642  |
| _cons    | .1798158  | .0266994  | 6.73  | 0.000 | .127486 .2321456     |

## Membentuk Persamaan VAR

\*\*contoh : kita sudah menentukan lag optimum dan melakukan regresi VAR.

\*\*command :

`var d.hours d.income, lags(1/(lag optimum))`



# Persamaan Linear & Matriks

## LINEAR

$$d.hours_t = 0,0831 - 0,0532d.hours_{t-1} + 0,16465 d.hours_{t-2} + 0,0037d.income_{t-1} + 0,0332d.income_{t-2}$$

$$d.income_t = 0,1798 + 0,0434 d.hours_{t-1} + 0,0643d.hours_{t-2} - 0,2989 d.income_{t-1} - 0,1485d.income_{t-2}$$

## MATRIKS

$$\begin{bmatrix} d.hours_t \\ d.income_t \end{bmatrix} = \begin{bmatrix} cons_1 \\ cons_2 \end{bmatrix} + \begin{bmatrix} \beta_{11} & \beta_{12} & \beta_{13} & \beta_{14} \\ \beta_{21} & \beta_{22} & \beta_{23} & \beta_{24} \end{bmatrix} \begin{bmatrix} d.hours_{t-1} \\ d.hours_{t-2} \\ d.income_{t-1} \\ d.income_{t-2} \end{bmatrix} + \begin{bmatrix} \varepsilon_{1t} \\ \varepsilon_{2t} \end{bmatrix}$$

$$\begin{bmatrix} d.hours_t \\ d.income_t \end{bmatrix} = \begin{bmatrix} 0,0831 \\ 0,1798 \end{bmatrix} + \begin{bmatrix} -0,0532 & 0,1645 & 0,0037 & 0,0332 \\ 0,0434 & 0,0643 & -0,2989 & -0,1485 \end{bmatrix} \begin{bmatrix} d.hours_{t-1} \\ d.hours_{t-2} \\ d.income_{t-1} \\ d.income_{t-2} \end{bmatrix} + \begin{bmatrix} \varepsilon_{1t} \\ \varepsilon_{2t} \end{bmatrix}$$

**Command:**

Var varname1 varname2, lags (1/lag optimum)







# Uji KAUSALITAS

Kausalitas merupakan suatu peristiwa yang menyebabkan peristiwa lain muncul (Sebab-akibat). Ada 2 tipe kausalitas:

- Unidirectional causality (searah) E  
x : Y2 ke Y1
- Bi-directional causality (dua arah)  
Ex : Y2 ke Y1 juga Y1 ke Y2

**Command:**

vargranger

---

Hipotesis

Ho : tidak terdapat hubungan kausalitas antar variabel  
Ha : terdapat hubungan kausalitas (1/2 arah) antar variabel

Kriteria

P-value < alfa -> Ho ditolak

P-value > alfa -> Ho tidak dapat ditolak





# UJI KESTABILAN MODEL

“

Command:

varstable, graph

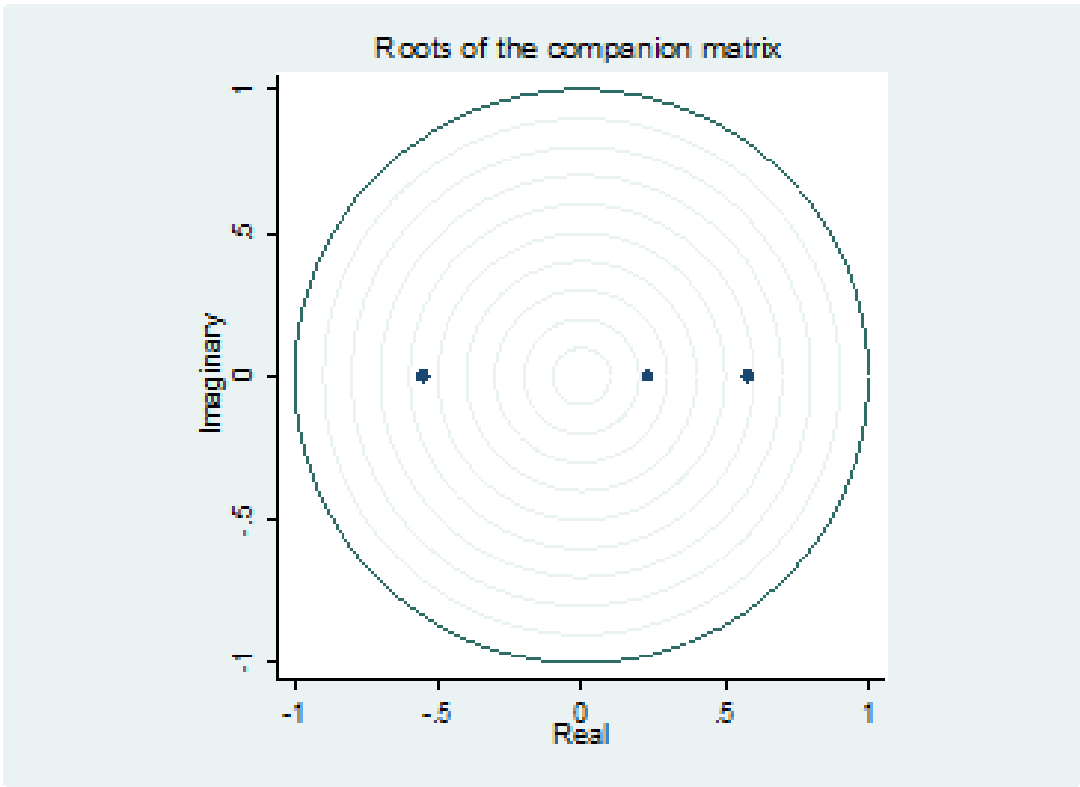
- Model dikatakan stabil apabila eigenvalue berada antara  $-1 \leq e \leq 1$  atau titik eigenvalue dalam grafik berada di dalam lingkaran

varstable, graph

Eigenvalue stability condition

| Eigenvalue | Modulus |
|------------|---------|
| .5789777   | .578978 |
| -.5539183  | .553918 |
| .2327889   | .232789 |

All the eigenvalues lie inside the unit circle.  
VAR satisfies stability condition.

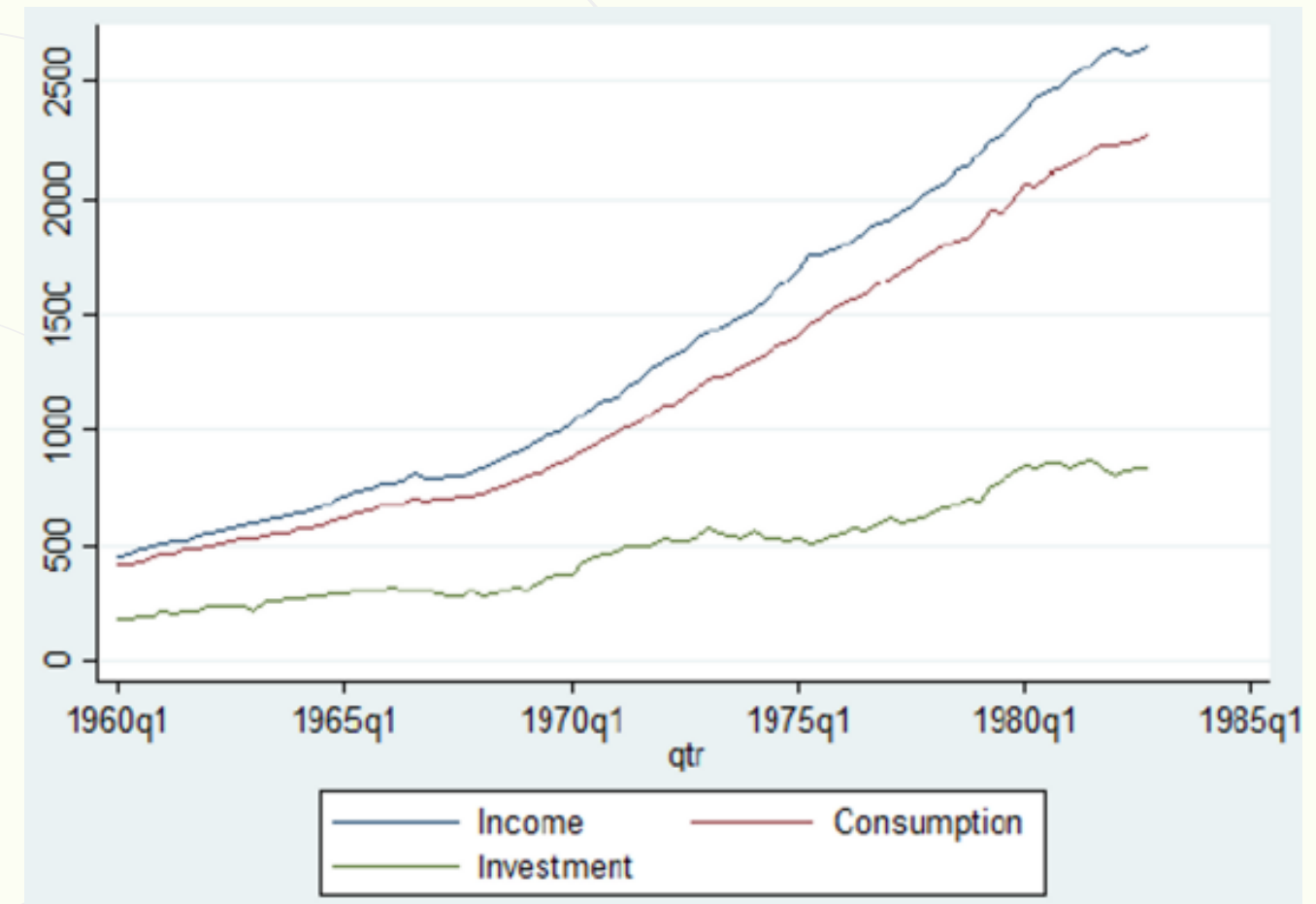




# UJI KOINTEGRASI

**Command:**

`tsline varname1 varname2`





# UJI KOINTEGRASI JOHANSEN

| Johansen tests for cointegration |       |            |                 |                 |                |
|----------------------------------|-------|------------|-----------------|-----------------|----------------|
| Trend: constant                  |       |            | Number of obs = |                 | 90             |
| Sample: 1960q3 - 1982q4          |       |            | Lags =          |                 | 2              |
| maximum                          |       |            |                 | 5%              |                |
| rank                             | parms | LL         | eigenvalue      | trace statistic | critical value |
| 0                                | 12    | -1093.0618 | .               | 42.4026         | 29.68          |
| 1                                | 17    | -1078.966  | 0.26893         | 14.2110*        | 15.41          |
| 2                                | 20    | -1073.4007 | 0.11633         | 3.0804          | 3.76           |
| 3                                | 21    | -1071.8605 | 0.03365         |                 |                |

## Hipotesis

Ho :  $r = 0$  (tidak terdapat kointegrasi antara variabel income, consumption, dan investment) Ha :  $r \neq 0$  (terdapat kointegrasi antara variabel income, consumption, dan investment)

## Kriteria

Trace statistic < critical value -> Ho tidak dapat ditolak

Trace statistic > critical value -> Ho ditolak

## Hasil

- rank(0): 42,4026 > 29,68 atau trace stat > critical value maka Ho ditolak
- rank(1): 14,2110 < 15,41 atau trace stat < critical value maka Ho tidak dapat ditolak
- rank (2): 3,0804 < 3,76 atau trace stat < critical value maka Ho tidak dapat ditolak

## Kesimpulan

Kesimpulan: Jadi, terdapat hubungan jangka panjang atau kointegrasi antara variabel income, consumption, dan investment sebanyak 1 kejadian.



# FORECASTING VAR

## Command :

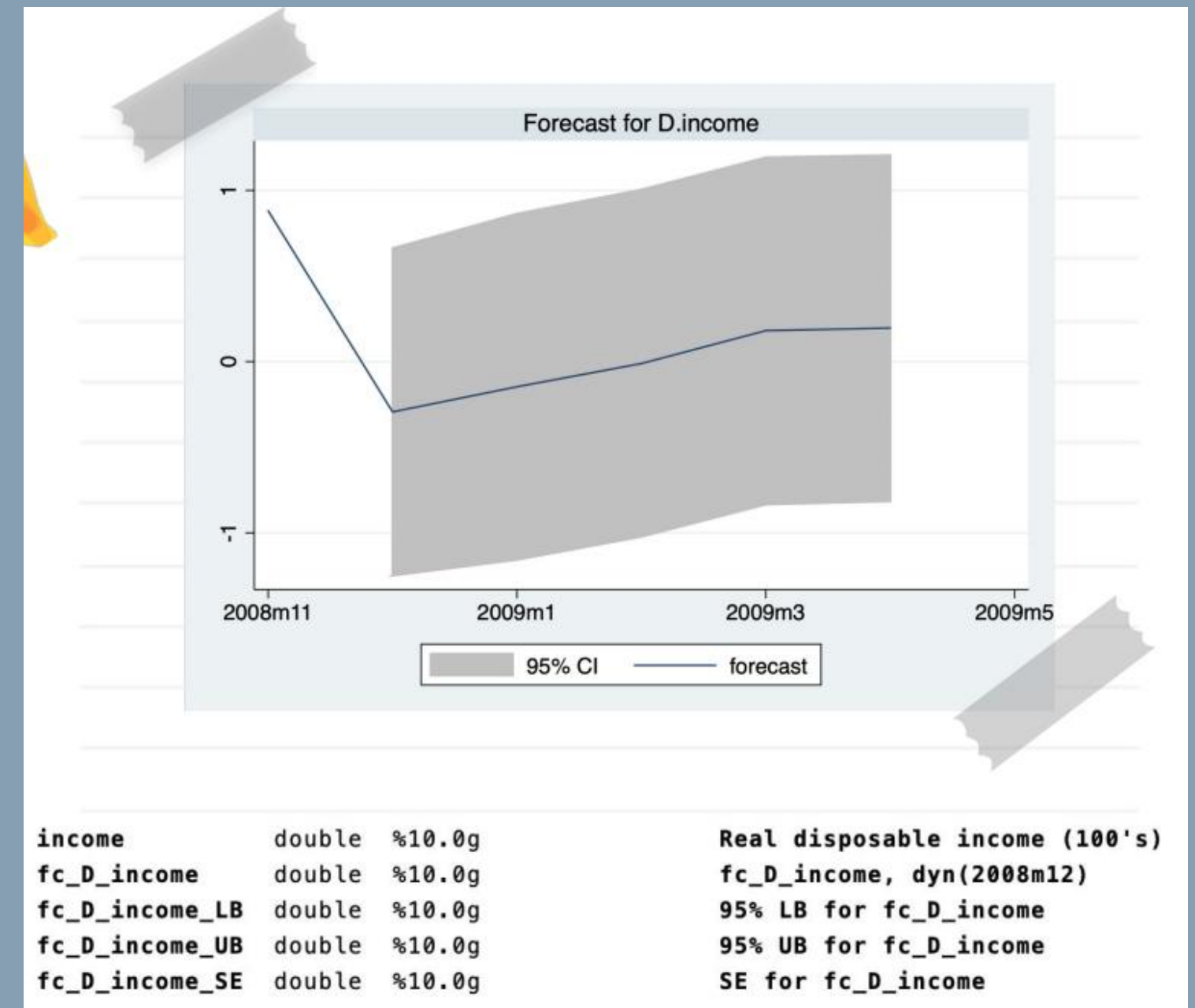
\*

- fcast compute fc\_, step(5)
- fcast graph fc\_D\_income

\*step menunjukkan jumlah periode yang ingin di forecast

\*fcast compute membuat variabel baru:

- Variabel baru yang diperkirakan
- Variabel batas bawah "LB"
- Variabel batas atas "UB"
- Variabel standar error "SE"





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# Thanks!

**Teaching Assistant Time Series  
Econometrics 2023**



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