

1 Intro & CLR

nonexperimental

cross section data, time series data, panel/longitudinal data

dependent variable/regressand, independent variables/regressors/explanatory variables

random sampling

CLR 1.1 - Linearity: error term

CLR 1.2 - Strict Exogeneity: orthogonal

CLR 1.3 - Spherical Errors: conditional homoskedasticity

CLR 1.4 - Full Rank: no perfect collinearity

Nonlinearities: interaction terms, semilog model, loglinear model, translog model

Non-constancy of parameters: indicator/dummy variables, interaction terms

Fixed Regressors (non-experimental)

2 OLS Basics

OLS estimator of β

Fitted value, residual, projection matrix P , annihilator matrix M

Residuals orthogonal to data: $X'\hat{\varepsilon} = 0$

Simple (2 var) CLR: formulas for slope and intercept, R , and r

Goodness of fit, centered/uncentered R squared, coefficient of determination, multiple correlation coefficient, adjusted R^2 , R bar squared SSR (Sum of Squared Residuals), TSS/SST (Total sum of squares, or total variation of the dependent variable), SSE (explained sum of squares)

perfect fit, no fit

partitioned form CLR, residual regression, double residual regression, Frisch-Waugh-Lovell theorem

demeaning, detrending, deseasonalizing

3 OLS Estimator Properties

$\hat{\beta}$ is: random variable, linear in Y , unbiased for β conditional on X (and also unconditional), BLUE (Gauss-Markov Thm)

$\hat{\sigma}^2$ is: unbiased conditionally and unconditionally

Prediction error, Mean Square Error (MSE), Conditional Expectation Function (CEF)/Population Regression Function (PRF), Sample error

4 CNLR

CNLR 1.5 - Joint Normality: independence between errors and regressors

Standardized p-variate RV: Z

Spectral/Eigenvalue decomposition, Jordan decomposition

Interval Estimation, coverage probability, confidence level, confidence intervals, critical value

Confidence intervals/regions for $\Gamma\beta$ at $(1 - \alpha)100\%$ confidence level for: Γ is $1 \times K$ or $N \times K$, and σ^2 known or unknown

Testing linear hypotheses: null, alternative, critical region, Type I/II Error, significance level, power function, test statistics: formulas for Z, t, W, F

Other formulas for F : SSR_u and SSR_r , restricted OLS, R_U^2 and R_R^2 , test of significance of the regression

Power functions of tests, non-central t and F , inapplicability of W_0 and F_0 to one-sided tests

Chow Test (aka Test of Structural Change)

5 Implications of Normality in CNLR

MLE's of β and σ^2

Fisher Information Matrix, Cramer-Rao lower bound (aka Information Inequality), $\beta_{OLS}, \hat{\sigma}_{OLS}^2$ are BUE in CNLR

Asymptotic normality and efficiency of $\hat{\beta}_{ML}$ and $\hat{\sigma}_{ML}^2$.

Asymptotic Tests of Nonlinear Hypotheses under CNLR: Wald, LR, Lagrange Multiplier (Score) Tests (aka Trinity); Trinity for linear hypotheses; critical region sizes $W \geq LR \geq LM$

6 Relaxing CLR/CNLR Assumptions

Perfect collinearity, multicollinearity, condition number

Misspecification of Regression: short model, long model

Non-spherical errors, GLR, GLS, Aitken's Thm

Joint normality, generalized t and F (aka robust), WLS

7 Asymptotic OLS, WLS/FWLS

Weakly consistency, asymptotic normality of OLS, approximate inference
Asymptotic distribution of OLS under conditional homoskedasticity
Heteroskedasticity-robust/White/Eicker-White covariance matrix estimator
Testing linear and non-linear restrictions, testing conditional homoskedasticity
WLS, FWLS with Conditional heteroskedasticity
Best linear prediction/projection (BLP) conditional on X
Convergence: in distribution, almost sure, in probability, in n^{th} moment
Limit Theorems: Mann-Wald/Continuity, Slutsky, Delta-Method, Cramer-Wold Device
LLNs: for iid data, for inid data, for did data, for dnid data, for asymptotically uncorrelated data, for covariance stationary sequences, for martingale difference sequences
CLTs: for iid, for inid, for did, for dnid, for Cov. stationary, for Martingale difference

8 Extremum Estimators

sample objective function, parameter space, NLS, ML, GMM, CMD
consistency, uniform convergence in probability, identification condition, compact parameter spaces
ULLN, asymptotic normality of M -estimators for iid data
Nonlinear Regression Model (NRM): Assumptions 1-12, NLS, WNLS
log-likelihood, MLE, Kullback Leibler Information Criterion, Consistency of MLE with and without compactness of parameter space
likelihood equations, asymptotic normality and efficiency of consistent roots (aka local MLEs)
MLE difficulties: non-unique likelihood functions, nonexistence of roots, multiple solutions; sufficient conditions for uniqueness; invariance under reparameterization
Asymptotic equivalency of trinity for MLEs; Trinity for generic extremum estimators; proof of asymptotic distributions (appendix)
Optimization Algorithms: Newton-Raphson, quadratic hill climbing, BHHH, method of scoring, quasi-Newton, DFP, Gauss Newton, downhill simplex, simulated annealing
Asymptotic equivalence of generic LM and LR

9 QR Models

QR/Discrete choice/quantal/categorical model; binary response/threshold crossing, multinomial response

Models: Linear Probability, Probit, Logit, Log-Weibull, Type-I Extreme Value Unobservable (latent) variable, indicator function, identical, observationally equivalent

Random utility interpretation

Estimation via NLS and WNLS, ML, Properties of MLE, odds ratio (OR)
Ordered and unordered models, MNL, IIA, Nested Logit Model (NML), Gumbel's Type B bivariate extreme-valued distribution, MNP