



Estimating Transit Fare Elasticity using Panel Models

Metro Vancouver Case Study

Mohamed Salah Mahmoud, PhD
Senior Modeller, Forecasting



Transit Fare Elasticity

“Elasticity values in the APTA study varied from -0.12 to -0.85 among the 52 transit systems”

[TRB's [TCRP REPORT 95](#)]

- For a 10% increase in fares in Metro Vancouver:
the difference between an assumed elasticity of -0.2 and -0.7 is $\sim 20\text{M}$ boardings per year
- That is $\sim \$30\text{M}$ annually!

Panel-data

- Time-series: 1990 – 2017 (monthly)
- Cross-sectional units:
 - 53 SkyTrain stations
 - 8 Bus depots
- Panel dimension (unbalanced) – long panel
 - $n = 61$ (cross-sectional units)
 - $T = 5 - 323$ (time periods)
 - $N = 11,926$ (total observations)

Econometric Model

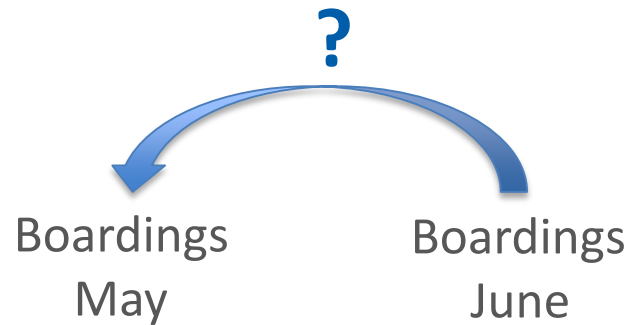
$$Y_{it} = X_{it}\beta + u_{it}$$

- Y_{it} is the number of boardings at station/depot i in month-year t
- X_{it} is a series of independent variables
- β is a vector of coefficients to be estimated
- u_{it} is the error term ($u_{it} = \underbrace{\alpha_i}_{\text{Individual effects}} + \underbrace{\varepsilon_{it}}_{\text{i.i.d}}$)

Econometric Model

- The underlying data generating process characterizes the econometric model structure

- Static
- Dynamic



Econometric Model

- Static Model

$$Y_{it} = X_{it}\beta + \alpha_i + \varepsilon_{it}$$

- Auto-correlation in the idiosyncratic errors

- Dynamic Model

$$Y_{it} = \varphi Y_{it-n} + X_{it}\beta + \alpha_i + \varepsilon_{it}$$

- φ is significant and close to 1
- Persistent auto-correlation in the idiosyncratic errors

- Omitted variable that is autoregressive?

- The DGP is not truly dynamic but rather static with an error term that is autoregressive

Econometric Model

- Fixed-effects (within estimator) Model with AR(1) Errors:

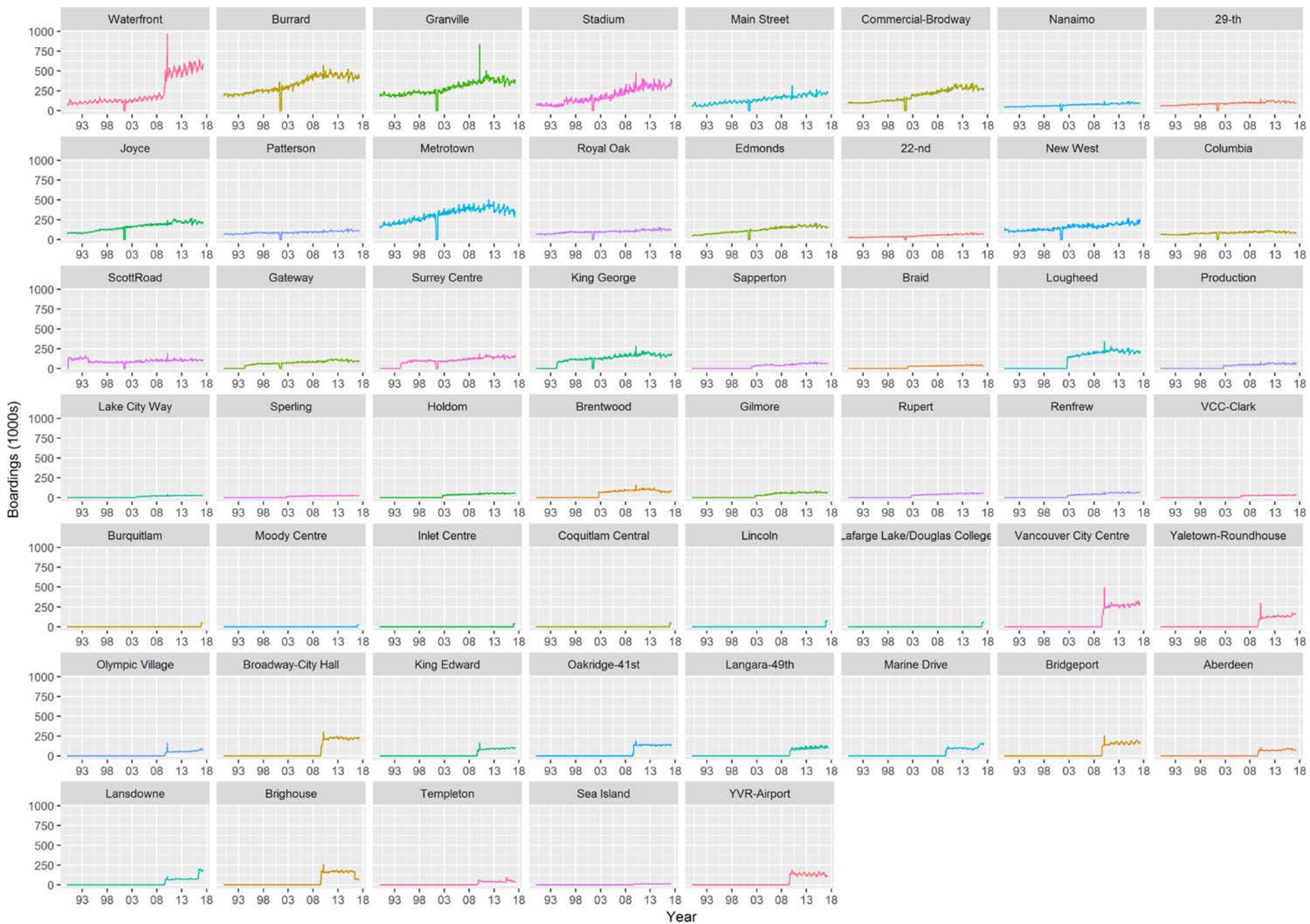
$$Y_{it} = X_{it}\beta + \alpha_i + \varepsilon_{it} \quad i = 1, \dots, N; t = 1, \dots, T$$

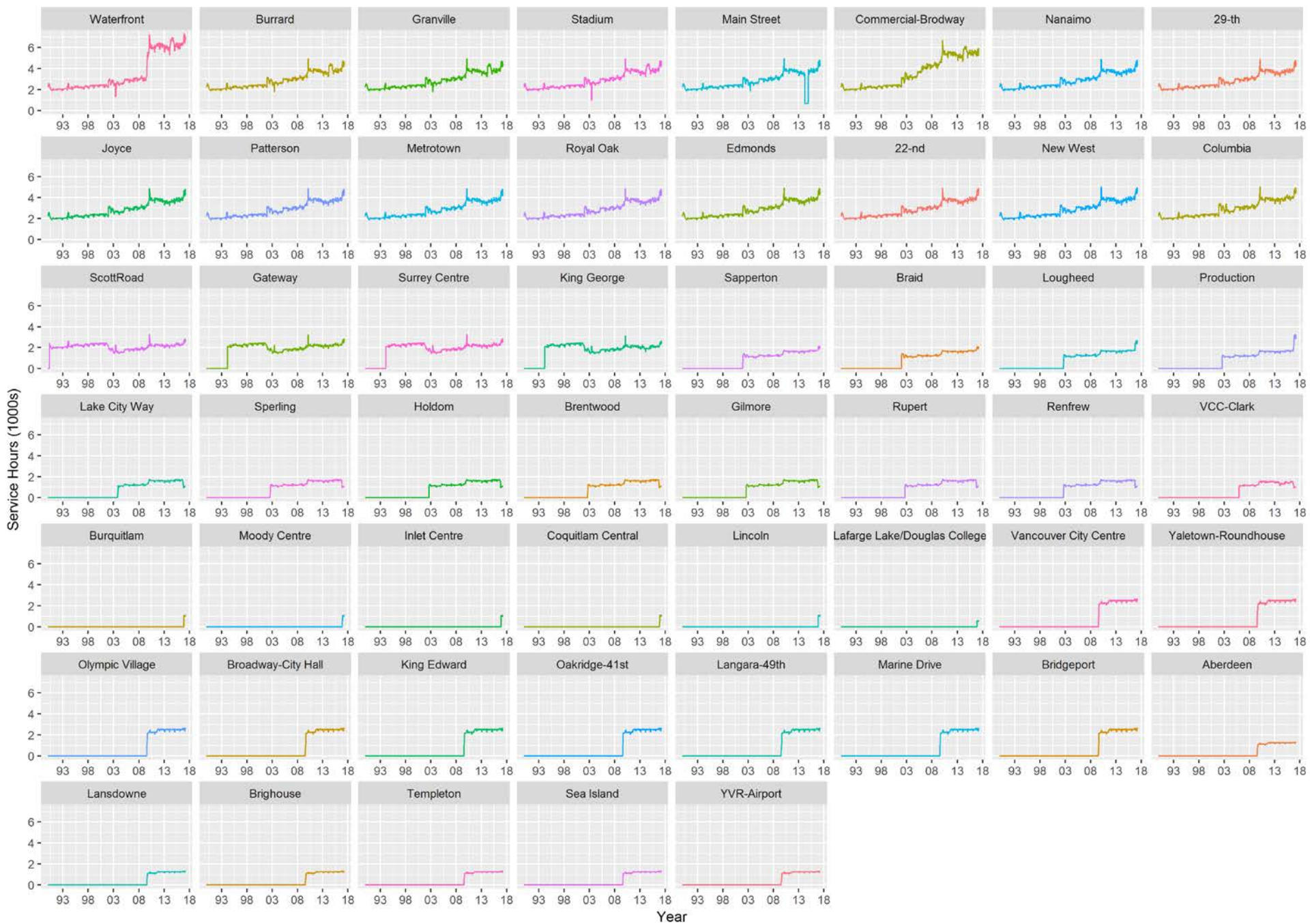
$$\varepsilon_{it} = \rho \varepsilon_{it-1} + \eta_{it}$$

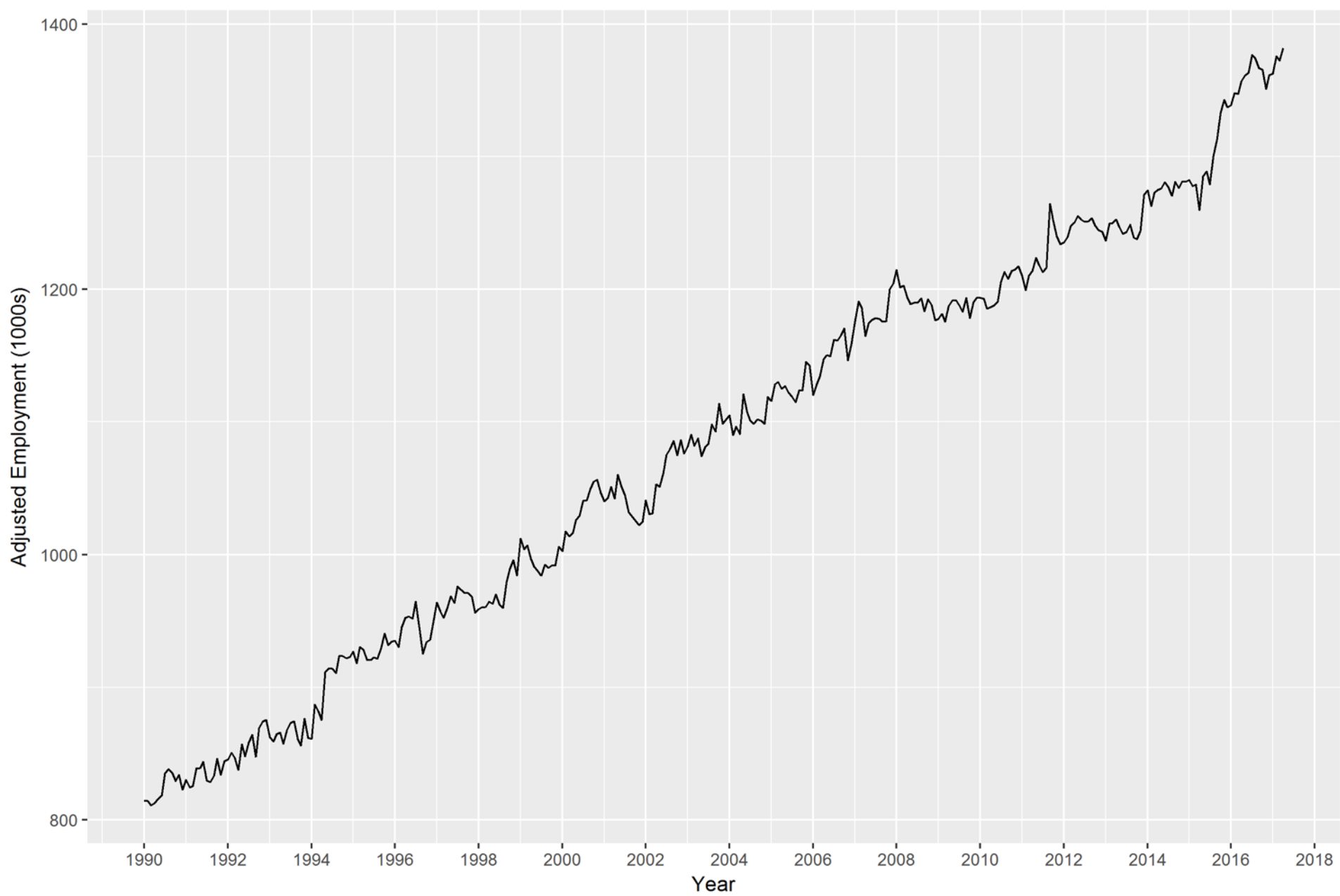
- $|\rho|$ is < 1
- η_{it} is independent and identically distributed (i.i.d) with mean 0 and variance σ_{η}^2
- α_i is the individual-specific fixed-effects

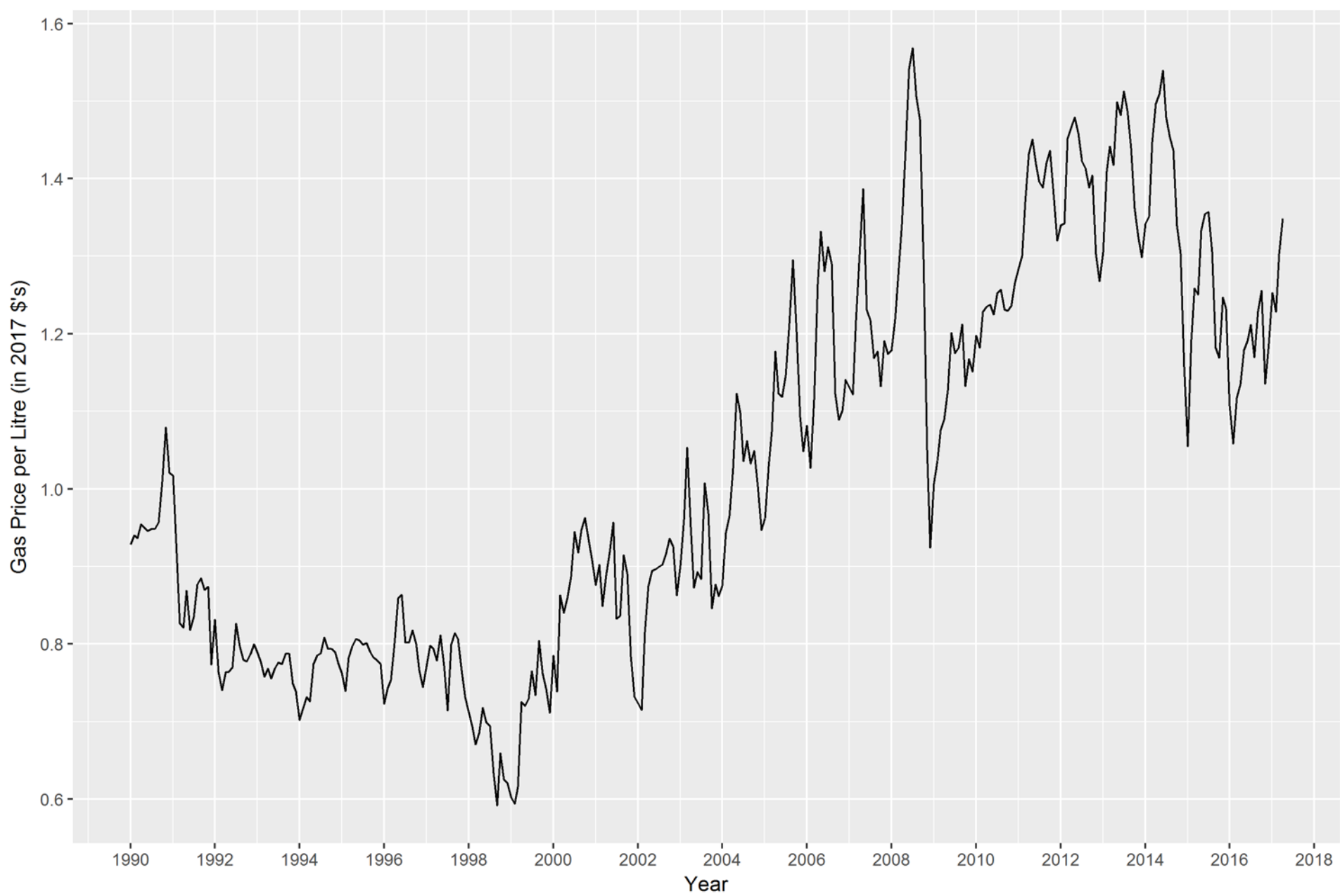
Variables

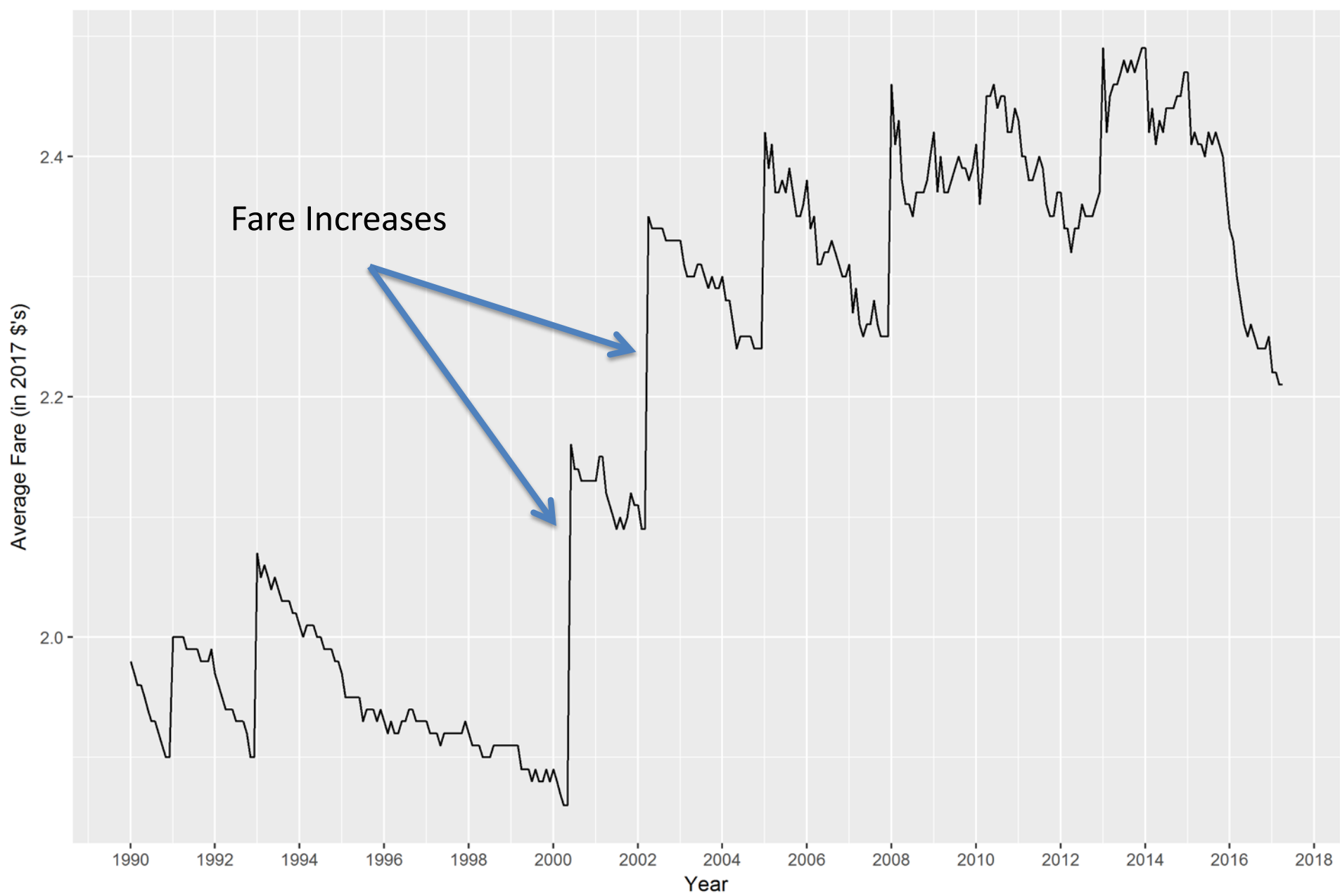
- Demand (number of boardings) ← Dependent Variable
- Supply (number of service hours) ← Instrumented (endogeneity)
- Employment
- Gas prices
- Transit fare







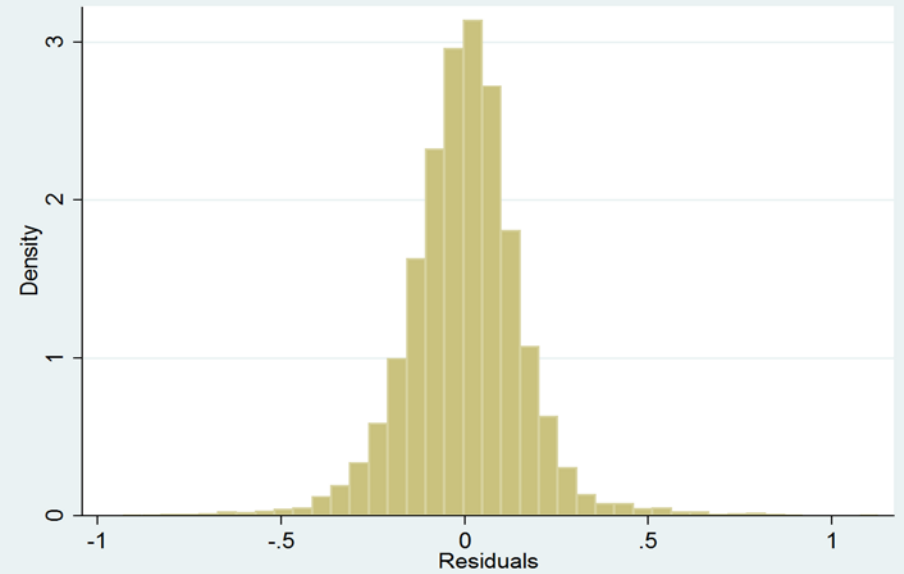
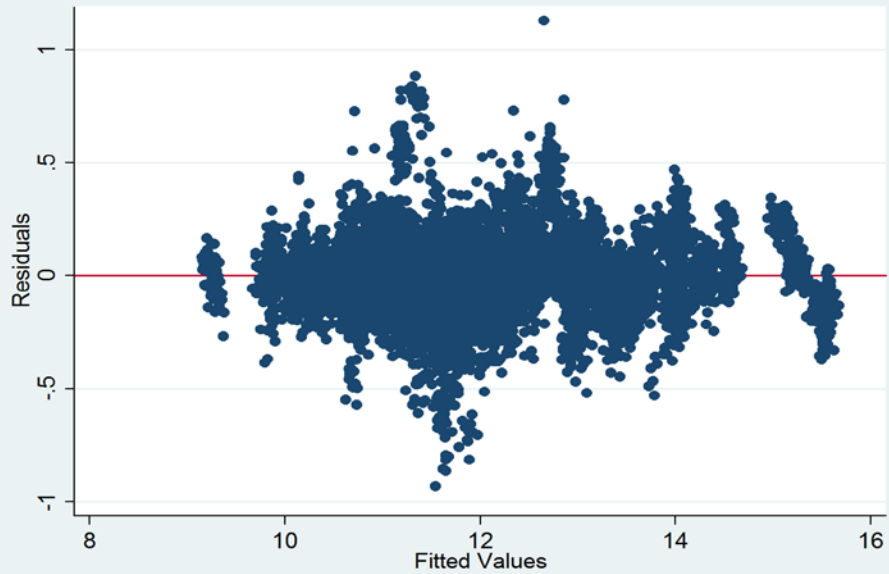




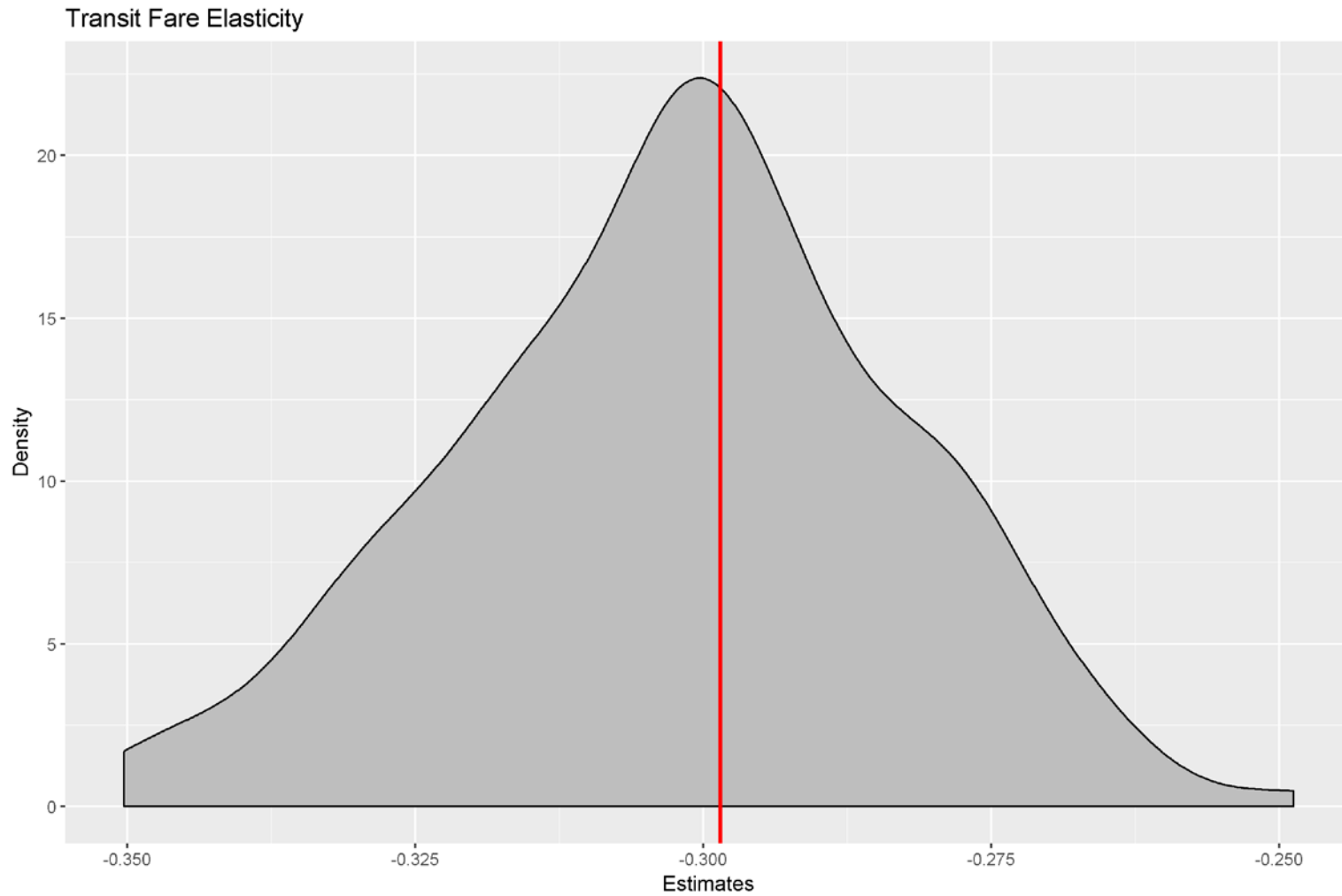
Model Results

- Fare elasticity $\sim -0.3\%$
 - A 1% increase in transit fares is associated with a 0.3% drop in ridership.
- Gas elasticity $\sim 0.08\%$
 - A 1% increase in gas prices is associated with a 0.08% increase in ridership.

Model Diagnostics



Model Validation



Acknowledgement

- Mark Pickup, Associate Professor, Simon Fraser University
- Jacob Fox, Senior Planner, TransLink

