

# Problem Set 3 - Grant Jackson

September 30, 2024

```
[1]: # Importing dataset
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt

df = pd.read_stata("C:\\Users\\gmoor\\Documents\\Applied Microeconomics\\Data\\cars1.
↳dta")

df.head()
```

```
[1]:   year  country  co  type  segment  domestic  firm  brand  loc  \
0  1983  Belgium  1  alfa 33  compact         0  AlfaRomeo  AlfaRomeo  Italy
1  1984  Belgium  1  alfa 33  compact         0  AlfaRomeo  AlfaRomeo  Italy
2  1985  Belgium  1  alfa 33  compact         0  AlfaRomeo  AlfaRomeo  Italy
3  1986  Belgium  1  alfa 33  compact         0  AlfaRomeo  AlfaRomeo  Italy
4  1987  Belgium  1  alfa 33  compact         0    Fiat  AlfaRomeo  Italy
```

```
   qu  ...  weight  pop  ngdp  ngdpe  country1  \
0  729.0  ...    890  9860000.0  4.188800e+12  234000000.0    1
1  1860.0  ...    890  9860000.0  4.512600e+12  234000000.0    1
2  1771.0  ...    890  9860000.0  4.834400e+12  234000000.0    1
3  2047.0  ...    890  9860000.0  5.084900e+12  234000000.0    1
4  2147.0  ...    910  9870000.0  5.318700e+12  234000000.0    1
```

```
   country2  country3  country4  country5  yearsquared
0         0         0         0         0    3932289.0
1         0         0         0         0    3936256.0
2         0         0         0         0    3940225.0
3         0         0         0         0    3944196.0
4         0         0         0         0    3948169.0
```

[5 rows x 27 columns]

## 1 (a) Summary statistics and correlation between LogPrice and LogQuantity:

```
[2]: # Summary statistics for 'quantity' and 'price'
print(df[['qu', 'pr']].describe())

# Histogram of 'quantity'
df['qu'].hist(bins=30)
plt.title('Histogram of Quantity')
plt.xlabel('Quantity')
plt.ylabel('Frequency')
plt.show()

# Histogram of 'price'
df['pr'].hist(bins=30)
plt.title('Histogram of Price')
plt.xlabel('Price')
plt.ylabel('Frequency')
plt.show()

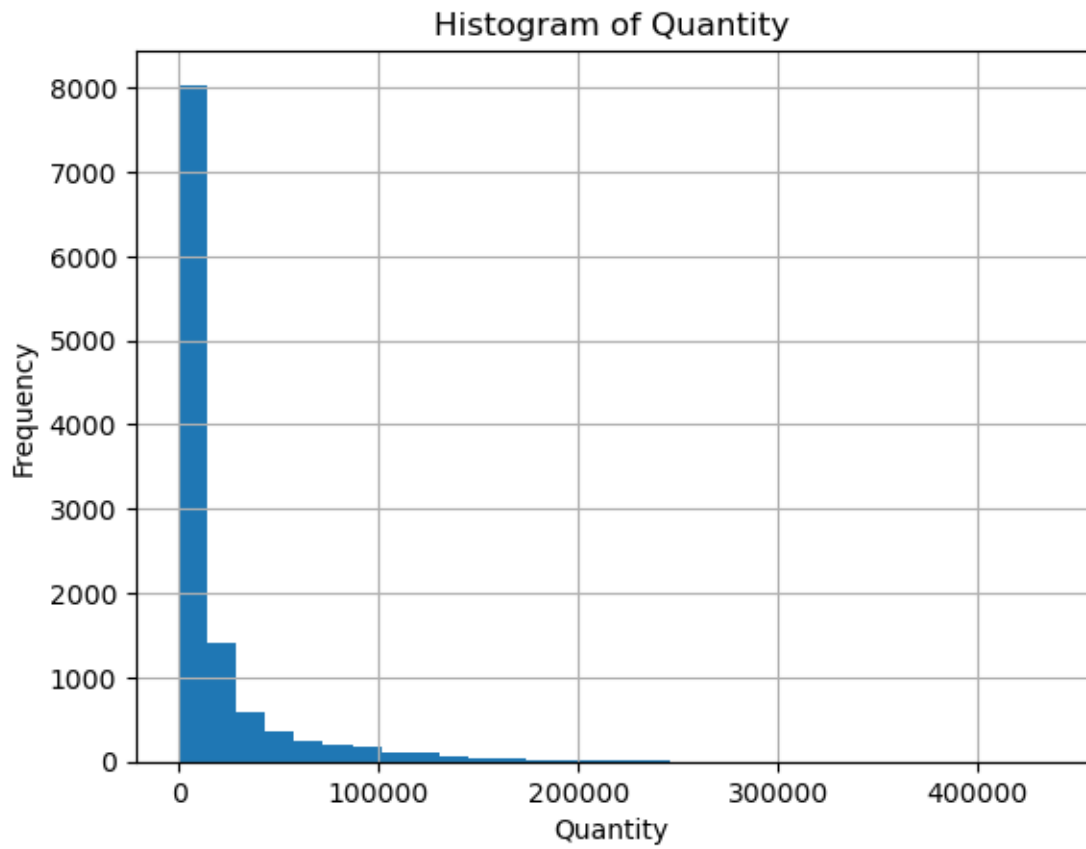
# Tabulate 'country'
print(df['country'].value_counts())

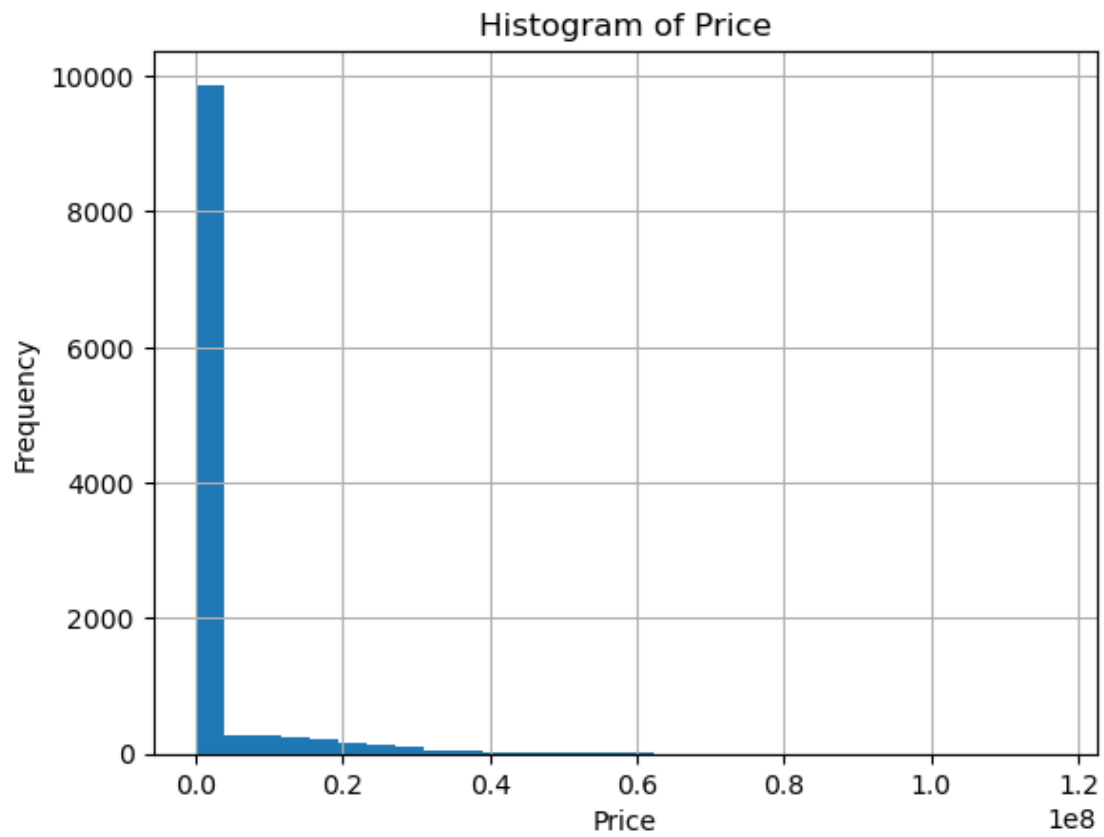
# Log transformations
df['lnq'] = np.log(df['qu'])
df['lnp'] = np.log(df['pr'])

# Scatter plot of log(price) vs log(quantity)
plt.scatter(df['lnp'], df['lnq'])
plt.title('Scatter plot of Log Price vs Log Quantity')
plt.xlabel('Log Price')
plt.ylabel('Log Quantity')
plt.show()

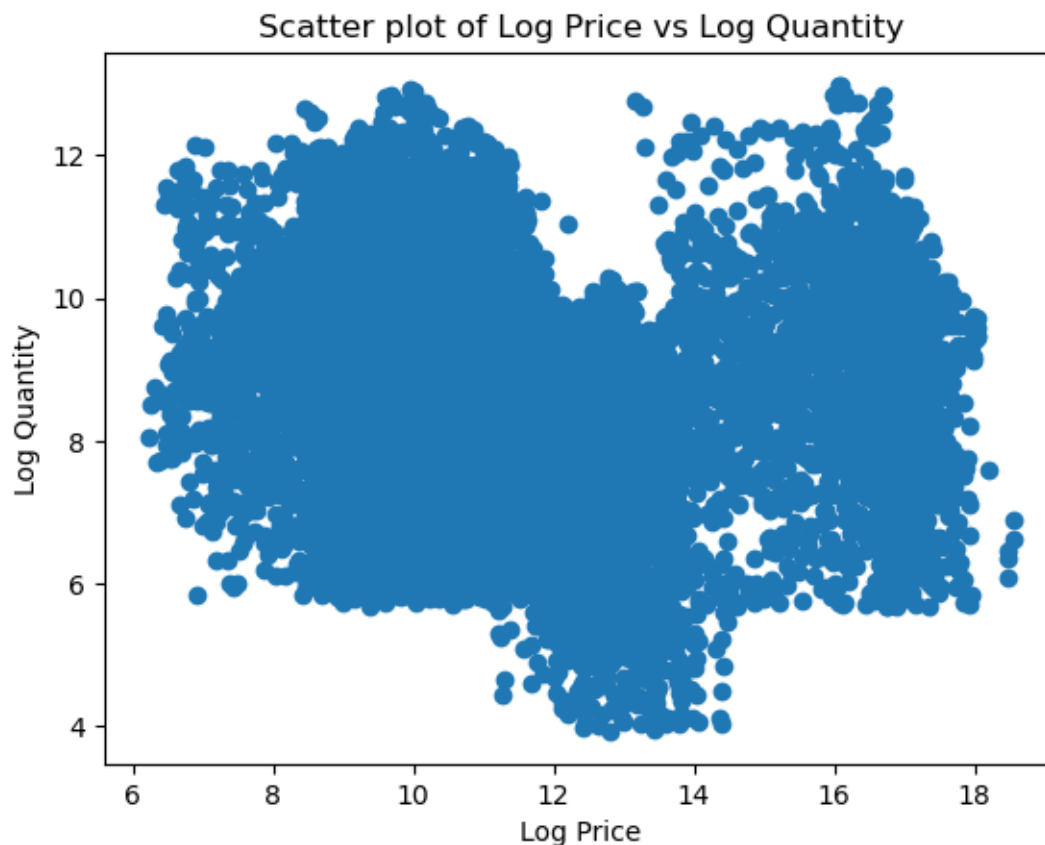
# Calculate and print correlation between log price and log quantity
print("Correlation between log(price) and log(quantity):", df[['lnp', 'lnq']].
      ↪corr())
```

	qu	pr
count	11483.000000	1.148300e+04
mean	19911.439453	2.857566e+06
std	37803.589844	8.237671e+06
min	51.000000	4.980000e+02
25%	1992.500000	1.324500e+04
50%	6262.000000	5.590000e+04
75%	18855.500000	4.136750e+05
max	433694.000000	1.166610e+08





```
country
Belgium    2641
UK          2289
Germany    2281
France     2252
Italy       2020
Name: count, dtype: int64
```



Correlation between log(price) and log(quantity):                      lnp                      lnq

lnp    1.000000   -0.135325

lnq   -0.135325    1.000000

## 2 (b) OLS-Fixed effects estimator of the standard logit model:

```
[3]: import statsmodels.formula.api as smf

# Construct market size, shares, and log-odds ratio
df['logpop'] = np.log(df['pop'])
df['loggdp'] = np.log(df['ngdp'])
df['msize'] = df['pop'] / 4
df['share'] = df['qu'] / df['msize']

# Calculate the outside goods market share
df['sum_share'] = df.groupby(['country', 'year'])['share'].transform('sum')
df['share0'] = 1 - df['sum_share']

# Generate log odds ratio
```

```

df['lsj_ls0'] = np.log(df['share'] / df['share0'])

# Run the fixed-effects OLS regression
fixed_effects_model = smf.ols(formula='lsj_ls0 ~ price + horsepower + fuel +_
↪ width + domestic + height + weight + logpop + loggdp + C(country) + C(year)_
↪ C(brand)', data=df).fit(cov_type='HC3')

# Print regression results
print(fixed_effects_model.summary())

```

C:\Users\gmoor\AppData\Local\Temp\ipykernel\_14212\2935626821.py:10:

FutureWarning: The default of observed=False is deprecated and will be changed to True in a future version of pandas. Pass observed=False to retain current behavior or observed=True to adopt the future default and silence this warning.

```
df['sum_share'] = df.groupby(['country', 'year'])['share'].transform('sum')
```

#### OLS Regression Results

```

=====
Dep. Variable:          lsj_ls0    R-squared:                0.574
Model:                  OLS        Adj. R-squared:           0.571
Method:                 Least Squares    F-statistic:          215.7
Date:                  Mon, 30 Sep 2024    Prob (F-statistic):      0.00
Time:                  22:31:41    Log-Likelihood:         -16060.
No. Observations:      11483    AIC:                   3.228e+04
Df Residuals:          11403    BIC:                   3.287e+04
Df Model:               79
Covariance Type:       HC3
=====
=====

```

	coef	std err	z	P> z
[0.025      0.975]				
-----				
Intercept	-25.4813	3.676	-6.931	0.000
-32.687      -18.276				
C(country) [T.France]	-2.1647	0.337	-6.425	0.000
-2.825      -1.504				
C(country) [T.Germany]	-2.1353	0.377	-5.663	0.000
-2.874      -1.396				
C(country) [T.Italy]	-2.5403	0.453	-5.605	0.000
-3.429      -1.652				
C(country) [T.UK]	-1.4538	0.341	-4.265	0.000
-2.122      -0.786				
C(year) [T.1971]	-0.0607	0.097	-0.628	0.530
-0.250      0.129				
C(year) [T.1972]	0.0047	0.094	0.050	0.960
-0.180      0.189				
C(year) [T.1973]	0.0329	0.099	0.333	0.739

-0.160	0.226				
C(year) [T. 1974]		-0.2245	0.093	-2.407	0.016
-0.407	-0.042				
C(year) [T. 1975]		-0.1367	0.094	-1.455	0.146
-0.321	0.047				
C(year) [T. 1976]		-0.0794	0.098	-0.812	0.417
-0.271	0.112				
C(year) [T. 1977]		-0.1148	0.101	-1.132	0.258
-0.314	0.084				
C(year) [T. 1978]		-0.1405	0.104	-1.357	0.175
-0.343	0.062				
C(year) [T. 1979]		-0.1670	0.107	-1.563	0.118
-0.376	0.042				
C(year) [T. 1980]		-0.2003	0.108	-1.849	0.064
-0.413	0.012				
C(year) [T. 1981]		-0.2450	0.111	-2.203	0.028
-0.463	-0.027				
C(year) [T. 1982]		-0.2763	0.115	-2.396	0.017
-0.502	-0.050				
C(year) [T. 1983]		-0.4077	0.118	-3.447	0.001
-0.640	-0.176				
C(year) [T. 1984]		-0.4909	0.123	-3.989	0.000
-0.732	-0.250				
C(year) [T. 1985]		-0.5242	0.126	-4.145	0.000
-0.772	-0.276				
C(year) [T. 1986]		-0.3772	0.130	-2.897	0.004
-0.632	-0.122				
C(year) [T. 1987]		-0.2583	0.133	-1.946	0.052
-0.518	0.002				
C(year) [T. 1988]		-0.2103	0.136	-1.548	0.122
-0.477	0.056				
C(year) [T. 1989]		-0.1965	0.140	-1.407	0.159
-0.470	0.077				
C(year) [T. 1990]		-0.1241	0.140	-0.889	0.374
-0.398	0.150				
C(year) [T. 1991]		-0.3117	0.148	-2.100	0.036
-0.603	-0.021				
C(year) [T. 1992]		-0.2175	0.150	-1.448	0.148
-0.512	0.077				
C(year) [T. 1993]		-0.3626	0.151	-2.403	0.016
-0.658	-0.067				
C(year) [T. 1994]		-0.3273	0.153	-2.135	0.033
-0.628	-0.027				
C(year) [T. 1995]		-0.4114	0.158	-2.608	0.009
-0.721	-0.102				
C(year) [T. 1996]		-0.3800	0.160	-2.372	0.018
-0.694	-0.066				
C(year) [T. 1997]		-0.3237	0.161	-2.016	0.044

-0.638	-0.009				
C(year) [T.1998]		-0.2896	0.163	-1.772	0.076
-0.610	0.031				
C(year) [T.1999]		-0.2987	0.165	-1.810	0.070
-0.622	0.025				
C(brand) [T.Audi]		0.3391	0.079	4.318	0.000
0.185	0.493				
C(brand) [T.BMW]		1.2500	0.066	18.933	0.000
1.121	1.379				
C(brand) [T.Citroën]		0.0385	0.064	0.604	0.546
-0.086	0.164				
C(brand) [T.Daihatsu]		-1.8908	0.093	-20.279	0.000
-2.073	-1.708				
C(brand) [T.Fiat]		0.1324	0.062	2.129	0.033
0.010	0.254				
C(brand) [T.Ford]		0.4308	0.066	6.495	0.000
0.301	0.561				
C(brand) [T.Honda]		-0.0663	0.069	-0.963	0.336
-0.201	0.069				
C(brand) [T.Hyundai]		-1.2078	0.091	-13.225	0.000
-1.387	-1.029				
C(brand) [T.Innocenti]		-1.5915	0.184	-8.644	0.000
-1.952	-1.231				
C(brand) [T.Lancia]		-0.6938	0.066	-10.590	0.000
-0.822	-0.565				
C(brand) [T.Mazda]		-0.5570	0.078	-7.112	0.000
-0.710	-0.403				
C(brand) [T.Mercedes]		1.9318	0.069	28.071	0.000
1.797	2.067				
C(brand) [T.Mitsubishi]		-0.8001	0.078	-10.286	0.000
-0.953	-0.648				
C(brand) [T.NissanDatsun]		0.1087	0.065	1.662	0.097
-0.020	0.237				
C(brand) [T.OpelVauxhall]		0.1819	0.066	2.743	0.006
0.052	0.312				
C(brand) [T.Peugeot]		0.3781	0.064	5.928	0.000
0.253	0.503				
C(brand) [T.Renault]		0.4264	0.062	6.902	0.000
0.305	0.548				
C(brand) [T.RoverTriumph]		-0.5540	0.067	-8.219	0.000
-0.686	-0.422				
C(brand) [T.Saab]		0.0122	0.077	0.158	0.875
-0.139	0.163				
C(brand) [T.Seat]		-0.6095	0.087	-7.029	0.000
-0.779	-0.440				
C(brand) [T.Skoda]		-0.5198	0.109	-4.790	0.000
-0.733	-0.307				
C(brand) [T.Suzuki]		-1.2152	0.085	-14.360	0.000



-1.381	-1.049				
C(brand) [T.Toyota]		-0.0785	0.068	-1.153	0.249
-0.212	0.055				
C(brand) [T.Volkswagen]		0.4506	0.069	6.511	0.000
0.315	0.586				
C(brand) [T.Volvo]		0.5539	0.072	7.689	0.000
0.413	0.695				
C(brand) [T.Talbot]		-0.5677	0.102	-5.588	0.000
-0.767	-0.369				
C(brand) [T.Kia]		-2.0625	0.132	-15.595	0.000
-2.322	-1.803				
C(brand) [T.Daewoo]		-0.7605	0.115	-6.638	0.000
-0.985	-0.536				
C(brand) [T.Rover]		-0.4990	0.126	-3.964	0.000
-0.746	-0.252				
C(brand) [T.MCC]		-0.7572	0.624	-1.214	0.225
-1.979	0.465				
C(brand) [T.DAF]		0.2415	0.126	1.912	0.056
-0.006	0.489				
C(brand) [T.Autobianchi]		-0.5020	0.199	-2.518	0.012
-0.893	-0.111				
C(brand) [T.Triumph]		-0.5173	0.188	-2.750	0.006
-0.886	-0.149				
C(brand) [T.Princess]		-1.0146	0.273	-3.721	0.000
-1.549	-0.480				
C(brand) [T.TalbotHillmanChrysler]		-0.9766	0.243	-4.023	0.000
-1.452	-0.501				
C(brand) [T.TalbotSimca]		0.4144	0.098	4.223	0.000
0.222	0.607				
C(brand) [T.TalbotMatra]		-1.7697	0.150	-11.833	0.000
-2.063	-1.477				
price		-0.0540	0.005	-11.646	0.000
-0.063	-0.045				
horsepower		-0.0170	0.002	-11.122	0.000
-0.020	-0.014				
fuel		-0.0719	0.013	-5.451	0.000
-0.098	-0.046				
width		0.0533	0.002	21.341	0.000
0.048	0.058				
domestic		1.7841	0.027	66.975	0.000
1.732	1.836				
height		-0.0147	0.003	-5.743	0.000
-0.020	-0.010				
weight		-0.0008	0.000	-5.146	0.000
-0.001	-0.001				
logpop		0.7517	0.197	3.823	0.000
0.366	1.137				
loggdp		0.1071	0.051	2.112	0.035

0.008            0.206

```
=====
Omnibus:                    648.617     Durbin-Watson:                    0.604
Prob(Omnibus):              0.000     Jarque-Bera (JB):              777.159
Skew:                      -0.589     Prob(JB):                     1.75e-169
Kurtosis:                   3.488     Cond. No.                     4.25e+05
=====
```

Notes:

[1] Standard Errors are heteroscedasticity robust (HC3)

[2] The condition number is large, 4.25e+05. This might indicate that there are strong multicollinearity or other numerical problems.

2.1 (b) Interpretation: The OLS regression results indicate price, horsepower, fuel consumption, and several other product characteristics significantly impact the log-odds ratio of market shares. The fixed effects for countries, years, and brands capture variations that are not directly explained by product characteristics. We can assume that higher prices reduce market share and domestic brands perform better.

### 3 (c) IV estimation of the standard logit model:

#### 3.1 [i]:

```
[4]: # Create the 'ones' column explicitly
df['ones'] = 1

# Group by country and year
group_cols = ['country', 'year']

# IV1 generation for each characteristic
df['numJ'] = df.groupby(group_cols)['ones'].transform('sum')

for col in ['horsepower', 'fuel', 'width', 'height', 'domestic', 'weight']:
    df[f'sum_{col}'] = df.groupby(group_cols)[col].transform('sum')
    df[f'IV1_{col}'] = df['numJ'] * df[col] - df[f'sum_{col}']
    df.drop(columns=[f'sum_{col}'], inplace=True)

# IV2 generation for each characteristic
for col in ['horsepower', 'fuel', 'width', 'height', 'domestic', 'weight']:
    df[f'mean_{col}'] = df.groupby(group_cols)[col].transform('mean')
    df[f'var_{col}'] = df.groupby(group_cols)[col].transform(lambda x: np.
    ↪var(x, ddof=0))
    df[f'IV2_{col}'] = df['numJ'] * (df[col] - df[f'mean_{col}']) ** 2 +
    ↪df['numJ'] * df[f'var_{col}']
    df.drop(columns=[f'mean_{col}', f'var_{col}'], inplace=True)
```

C:\Users\gmoor\AppData\Local\Temp\ipykernel\_14212\2348775012.py:8:

```

FutureWarning: The default of observed=False is deprecated and will be changed
to True in a future version of pandas. Pass observed=False to retain current
behavior or observed=True to adopt the future default and silence this warning.
    df['numJ'] = df.groupby(group_cols)['ones'].transform('sum')
C:\Users\gmoor\AppData\Local\Temp\ipykernel_14212\2348775012.py:11:
FutureWarning: The default of observed=False is deprecated and will be changed
to True in a future version of pandas. Pass observed=False to retain current
behavior or observed=True to adopt the future default and silence this warning.
    df[f'sum_{col}'] = df.groupby(group_cols)[col].transform('sum')
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    df[f'sum_{col}'] = df.groupby(group_cols)[col].transform('sum')
C:\Users\gmoor\AppData\Local\Temp\ipykernel_14212\2348775012.py:17:
FutureWarning: The default of observed=False is deprecated and will be changed
to True in a future version of pandas. Pass observed=False to retain current
behavior or observed=True to adopt the future default and silence this warning.
    df[f'mean_{col}'] = df.groupby(group_cols)[col].transform('mean')
C:\Users\gmoor\AppData\Local\Temp\ipykernel_14212\2348775012.py:18:
FutureWarning: The default of observed=False is deprecated and will be changed
to True in a future version of pandas. Pass observed=False to retain current
behavior or observed=True to adopt the future default and silence this warning.
    df[f'var_{col}'] = df.groupby(group_cols)[col].transform(lambda x: np.var(x,
ddof=0))
C:\Users\gmoor\AppData\Local\Temp\ipykernel_14212\2348775012.py:17:
FutureWarning: The default of observed=False is deprecated and will be changed
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FutureWarning: The default of observed=False is deprecated and will be changed

```

to True in a future version of pandas. Pass observed=False to retain current behavior or observed=True to adopt the future default and silence this warning.

```
df[f'var_{col}'] = df.groupby(group_cols)[col].transform(lambda x: np.var(x, ddof=0))
```

### 3.2 [ii]:

```
[5]: from linearmodels.iv import IV2SLS

# Define the endogenous variable and instruments
endog = df['price']
exog = df[['horsepower', 'fuel', 'width', 'domestic', 'height', 'weight',
           ↪ 'logpop', 'loggdp']]
iv = df[['IV1_horsepower', 'IV1_fuel', 'IV1_width', 'IV1_domestic',
           ↪ 'IV1_height', 'IV1_weight',
           'IV2_horsepower', 'IV2_fuel', 'IV2_width', 'IV2_domestic',
           ↪ 'IV2_height', 'IV2_weight']]

# Run 2SLS
iv_model = IV2SLS(df['lsj_ls0'], exog, endog, iv).fit(cov_type='robust')

# Print IV regression results
print(iv_model.summary)
```

#### IV-2SLS Estimation Summary

```
=====
Dep. Variable:          lsj_ls0      R-squared:          0.9759
Estimator:              IV-2SLS      Adj. R-squared:      0.9759
No. Observations:      11483        F-statistic:        4.739e+05
Date:                  Mon, Sep 30 2024    P-value (F-stat)      0.0000
Time:                  22:31:41          Distribution:        chi2(9)
Cov. Estimator:        robust
```

#### Parameter Estimates

```
=====
      Parameter  Std. Err.    T-stat    P-value    Lower CI    Upper CI
-----
horsepower    -0.0403     0.0016   -24.631    0.0000    -0.0435    -0.0371
fuel          -0.1257     0.0090   -13.986    0.0000    -0.1433    -0.1081
width          0.0407     0.0020    20.643    0.0000     0.0368     0.0445
domestic       1.8663     0.0277    67.311    0.0000     1.8120     1.9206
height        -0.0212     0.0021   -10.342    0.0000    -0.0252    -0.0172
weight         0.0009     0.0002     5.8332    0.0000     0.0006     0.0012
logpop        -0.5107     0.0133   -38.260    0.0000    -0.5369    -0.4846
loggdp        -0.0074     0.0053    -1.3823    0.1669    -0.0179     0.0031
price          0.0074     0.0054     1.3780    0.1682    -0.0031     0.0179
=====
```

Endogenous: price  
 Instruments: IV1\_horsepower, IV1\_fuel, IV1\_width, IV1\_domestic, IV1\_height,  
 IV1\_weight, IV2\_horsepower, IV2\_fuel, IV2\_width, IV2\_domestic, IV2\_height,  
 IV2\_weight  
 Robust Covariance (Heteroskedastic)  
 Debiased: False

3.3 (c) Interpretation: IV-2SLS regression results indicate that price does not significantly affect the logg-odds ratio of market shares, unlike the OLS regression results. Product characteristics like fuel efficiency, horsepower, width, and whether the product is domestic or not are a critical role in determining the market share.

4 (d) Willingness to pay (WTP) for fuel efficiency:

```
[6]: # Extract coefficients
alpha_price = iv_model.params['price']
beta_fuel = iv_model.params['fuel']

# Calculate WTP
wtp = -beta_fuel / alpha_price
print("WTP =", wtp)
```

WTP = 17.02297811927135

5 (e) Price elasticity of demand:

```
[7]: # Calculate price elasticity for each observation
df['elasticity'] = -alpha_price * (1 - df['share']) * df['price']

# Summary statistics for elasticity
print(df['elasticity'].describe())

# Grouped summary by country
print(df.groupby('country')['elasticity'].describe())
```

```
count      11483.000000
mean        -0.136380
std          0.065894
min         -1.109948
25%         -0.167440
50%         -0.120858
75%         -0.090494
max         -0.038727
Name: elasticity, dtype: float64
```

	count	mean	std	min	25%	50%	75%	\
country								

Belgium	2641.0	-0.122916	0.057286	-0.584867	-0.148144	-0.108314	-0.080914
France	2252.0	-0.126195	0.054265	-0.605196	-0.151067	-0.113383	-0.088205
Germany	2281.0	-0.115675	0.047870	-0.434030	-0.139046	-0.102258	-0.081249
Italy	2020.0	-0.139380	0.068858	-0.754498	-0.172105	-0.121909	-0.093703
UK	2289.0	-0.179921	0.077428	-1.109948	-0.218538	-0.162612	-0.128583

```

max
country
Belgium -0.041893
France -0.044899
Germany -0.042839
Italy -0.038727
UK -0.055180

```

```

C:\Users\gmoor\AppData\Local\Temp\ipykernel_14212\3733935762.py:8:
FutureWarning: The default of observed=False is deprecated and will be changed
to True in a future version of pandas. Pass observed=False to retain current
behavior or observed=True to adopt the future default and silence this warning.
print(df.groupby('country')['elasticity'].describe())

```