The data file liquor contains observations on annual expenditure on liquor (LIQUOR) and annual income (INCOME) (both in thousands of dollars) for 40 randomly selected households for three consecutive years.

b. Estimate the model $LIQUOR_{it} = \beta_1 + \beta_2 INCOME_{it} + u_i + e_{it}$ using random effects. Construct a 95% interval estimate of the coefficient on INCOME. How does it compare to the interval in part (a)? Ans.

```
LIQUOR_{it} = 0.96903 + 0.02658 \cdot INCOME_{it}
```

```
Oneway (individual) effect Random Effect Model
   (Swamy-Arora's transformation)
plm(formula = liquor ~ income, data = pdata, model = "random")
Balanced Panel: n = 40, T = 3, N = 120
Effects:
               var std.dev share
idiosyncratic 0.9640 0.9819 0.571
individual 0.7251 0.8515 0.429
theta: 0.4459
Residuals:
          1st Qu.
                     Median 3rd Qu.
Coefficients:
            Estimate Std. Error z-value Pr(>|z|)
(Intercept) 0.9690324 0.5210052 1.8599 0.0628957
         0.0265755 0.0070126 3.7897 0.0001508 ***
income
Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' '1
Total Sum of Squares:
                       126.61
Residual Sum of Squares: 112.88
R-Squared:
              0.1085
                                                                    2.5 %
                                                                             97.5 %
Adj. R-Squared: 0.10095
                                                    (Intercept) -0.05211904 1.99018381
Chisq: 14.3618 on 1 DF, p-value: 0.00015083
                                                    income
                                                               0.01283111 0.04031983
```

使用 random effects model 進行估計後,結果顯示 income 對 liquor 支出具有正向且統計上顯著的影響 (估計值為 0.0266,p 值 < 0.001)。每當 household 年收入增加 \$1,000,預期酒類支出會增加 \$26.6 元。 INCOME 95% 信賴區間 [0.0128, 0.0403] 不包含 0,結果顯著,因此可以拒絕虛無假設,認為收入變化會顯著影響酒類支出。

Recall: (a) 的結果是,信賴區間涵蓋了 0,結果不顯著,因此無法拒絕虛無假設,無法說明收入變化顯著影響酒類支出。因此,(a) 與 (b) 得出相反的推論。

c. Test for the presence of random effects using the LM statistic in equation (15.35). Use the 5% level of significance.

Ans. LM test

 $H_0:\sigma_u^2=0$ (No random effects) $H_1:\sigma_u^2>0$ (Random effects exist) LM 統計量(Chi–squared)為 20.68 > 臨界值 3.84,且 p 值遠小於 0.05 顯著水準。因此,拒絕虛無假設 $H_0:\sigma_u^2=0$,表示模型中存在顯著的 random effects。

```
Lagrange Multiplier Test - (Breusch-Pagan)

data: liquor ~ income

chisq = 20.68, df = 1, p-value = 5.429e-06

alternative hypothesis: significant effects

[1] 3.841459
```

d. For each individual, compute the time averages for the variable INCOME. Call this variable INCOMEM. Estimate the model $LIQUOR_{it} = \beta_1 + \beta_2 INCOME_{it} + \gamma INCOMEM_i + c_i + e_{it}$ using the random effects estimator. Test the significance of the coefficient γ at the 5% level. Based on this test, what can we conclude about the correlation between the random effect u_i and INCOME? Is it OK to use the random effects estimator for the model in (b)?

Ans. Mundlak test

 $H_0: \gamma=0$ (No endogeneity) $H_1: \gamma \neq 0$ (Endogeneity) INCOMEM 的 p 值 = 0.7670 > 0.05,表示我們無法拒絕虛無假設 $H_0: \gamma=0$ 换句話說,「戶別的平均收入與個體隨機效果 u_i 之間沒有統計上的顯著相關」。沒有證據顯示 u_i 與 INCOME 有相關性。

根據此檢定結果,使用 random effects 模型是合理的(沒有違反其關鍵假設:隨機效果與自變數無關)。

```
Oneway (individual) effect Random Effect Model
  (Swamy-Arora's transformation)
Call:
plm(formula = liquor ~ income + INCOMEM, data = pdata_m, model = "random")
Balanced Panel: n = 40, T = 3, N = 120
Effects:
                var std.dev share
idiosyncratic 0.9640 0.9819 0.571
individual 0.7251 0.8515 0.429
theta: 0.4459
Residuals:
    Min.
          1st Qu. Median 3rd Qu.
-2.300955 -0.703840 0.054992 0.560255 2.257325
Coefficients:
            Estimate Std. Error z-value Pr(>|z|)
(Intercept) 0.9163337 0.5524439 1.6587 0.09718 .
income
         0.0207421 0.0209083 0.9921 0.32117
INCOMEM
         0.0065792 0.0222048 0.2963 0.76700
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' '1
Total Sum of Squares:
                      126.61
Residual Sum of Squares: 112.79
R-Sauared:
               0.10917
Adj. R-Squared: 0.093945
Chisq: 14.3386 on 2 DF, p-value: 0.00076987
```