```
In [1]:
import numpy as np
import pandas as pd
import statsmodels.api as sm
In [2]:
pd.set_option('display.max_rows', None)
pd.set_option('display.max_columns', None)
In [5]:
df = pd.read_excel('05-19data/制造业工业表.xlsx')
In [6]:
df
Out[6]:
          出荷额
                 中间投入 資本サービス投入指数 実質資本ストック指数
0 2009 233860164 134270200
                                  1.031655
                                                  1.027320
1 2010 258645824 148766344
                                  1.009572
                                                  1.008295
2 2011 252549212 147308571
                                  1.000000
                                                  1.000000
3 2012 257281277 149299186
                                 0.995938
                                                  0.995815
4 2013 260826123 151820385
                                 0.988484
                                                  0.990102
                                  0.991805
                                                  0.992691
5 2014 272904301 161253005
6 2015 279553100 159511845
                                  1.005195
                                                  1.003080
7 2016 270703974 149408500
                                  1.018142
                                                  1.014045
8 2017 287074969 161237634
                                  1.031694
                                                  1 025467
9 2018 299705734 171506083
                                  1.052968
                                                  1.042834
In [7]:
df2 = pd.read_excel('05-19data/washed_data.xlsx',index_col=0)
In [11]:
data = pd.merge(left = df,right = df2,on = 'year',how = 'outer')
In [18]:
data.drop(columns = '学历年龄',inplace=True)
In [21]:
len(data.columns)
Out[21]:
In [22]:
data['ckb'] = data['資本サービス投入指数']*data['実質資本ストック指数']
In [23]:
data['total working time'] = data['所定内実労働時間数'] + data['超過実労働時間数']
In [24]:
data['salary'] = data['きまって支給する現金給与額(千円)'] *12 +data['年間賞与その他特別給与額(千円)']
In [25]:
data['勤続年数2乘'] = np.square(data['勤続年数'])
```

```
In [26]:
data = data.astype(np.float64)
In [28]:
data['実際中间投入'] = np.log(data['中间投入'])
In [341:
data['実質産出'] = np.log(data['出荷额'])
In [45]:
male data = data[data['sex']==1]
In [47]:
male data.reset index(drop = 'index',inplace=True)
In [54]:
female data = data[data['sex'] ==0]
In [55]:
female_data.reset_index(inplace=True,drop = 'index')
In [56]:
female_data
  4 2009.0 233860164.0 134270200.0 1.031655 1.027320 37.5 10.0 166.0
                                                                                               298.0
                                                                                                                                        173.0 2430.1
                                                                      7.0 174.6 165.8
                                                                                                           9.0 0.0 1.059840
  5 2009.0 233860164.0 134270200.0 1.031655 1.027320 42.7
                                                           9.6
                                                               162.0
                                                                      8.0 175.7 166.6
                                                                                       270.4
                                                                                               262.0
                                                                                                           9.0 0.0 1.059840
                                                                                                                                        170.0 2378.8
  6 2009.0 233860164.0 134270200.0 1.031655 1.027320 47.6 15.9
                                                               168.0
                                                                      5.0 202.0
                                                                                192.3
                                                                                       431.1
                                                                                               346.0
                                                                                                           9.0
                                                                                                               0.0 1.059840
                                                                                                                                        173.0 2855.1
  7 2009.0 233860164.0 134270200.0 1.031655 1.027320 52.8 21.1
                                                                                               900.0
                                                                                                                                        169.0 3102.2
                                                               164.0
                                                                      5.0 206.8
                                                                                199.0
                                                                                       620.6
                                                                                                           9.0
                                                                                                               0.0 1.059840
  8 2009.0 233860164.0
                       134270200.0 1.031655 1.027320 57.6 23.2
                                                               163.0
                                                                      5.0 209.6 201.4
                                                                                       576.1
                                                                                              2289.0
                                                                                                           9.0
                                                                                                               0.0 1.059840
                                                                                                                                        168.0 3091.3
    2009.0 233860164.0 134270200.0 1.031655 1.027320 41.3 12.8
                                                               164.0
                                                                      7.0 209.2
                                                                                198.6
                                                                                       573.0
                                                                                             61080.0
                                                                                                          12.0
                                                                                                               0.0 1.059840
                                                                                                                                        171.0 3083.4
  9
     2009.0 233860164.0
                       134270200.0 1.031655 1.027320 22.3
                                                                                167.8
                                                                                              5521.0
                                                                                                          12.0
                                                                                                                   1.059840
                                                                                                                                        177.0 2639.6
 10
     2009.0 233860164.0
                       134270200.0 1.031655 1.027320 27.6
                                                           6.5
                                                               165.0
                                                                      8.0
                                                                          196.0
                                                                                184.3
                                                                                       550.7
                                                                                              5614.0
                                                                                                          12.0
                                                                                                               0.0 1.059840
                                                                                                                                        173.0 2902.7
 12 2009.0 233860164.0
                       134270200.0 1.031655 1.027320 32.5 10.0
                                                               163.0
                                                                      7 0 207 4 196 4
                                                                                       601.2
                                                                                              6162 0
                                                                                                          12.0
                                                                                                               0.0 1.059840
                                                                                                                                        170.0 3090.0
                                                                                                                                        168.0 3357.0
 13 2009.0 233860164.0
                       134270200.0 1.031655 1.027320 37.4 12.8
                                                               162.0
                                                                      6.0 222.5 212.1
                                                                                       687.0
                                                                                              8295.0
                                                                                                          12.0
                                                                                                               0.0 1.059840
 14 2009.0 233860164.0 134270200.0 1.031655 1.027320 42.5 13.7 162.0
                                                                      7.0 223.8 211.5
                                                                                       664.6
                                                                                              8211.0
                                                                                                          12.0 0.0 1.059840
                                                                                                                                        169.0 3350.2
    0000 0 000000104 0 404070000 0 4 004055 4 007000 47 0 45 7 404 0
                                                                                                          100 00 1050040
                                                                                                                                        470 0 0040 0
```

In []:

女性モデル

```
log(y(t)) = C + + al*exp + a2*exp_square + a3*edu + a4*log(ME(t)) + a5*log(CKB(t)) + a6*Full + u y: 実質産出 exp:勤続年数 exp_square:勤続年数2乗 edu:教育年数 ME(t): 実際中間投入(t年での条件) CKB(t): 資本サービス投入指数 * 実質資本ストック指数(t年での条件) Full: 总劳动时间
```

In [82]:

res = sm.OLS(y,feature).fit()

```
In [69]:
female_data.head()
Out[69]:
                                                                   きま
                                                                              年間
                                                                              賞与
                                                         所定
                                                                        所定
                                                               実労
                                                                   支給
                                                                              その
                               資本サー
                                                                        内給
                                                                                   労働者
                                                                   する
                                                                              他特
              出荷额
                       中间投入
                               ビス投入
                                                                        与額
                                                                                    数(十
                                                                                         education sex
                                                                                                         ckb total_working_time s
                                                               働
                                                                   現金
                                         ック指
                                                                              別給
                                                               時
                                                                   給与
                                                                              与額
                                                               間
                                                                  額(千
                                                                               (Ŧ
                                                               数
                                                                               円)
                                                                    円)
0 2009.0 233860164.0 134270200.0 1.031655 1.02732 51.9 17.2 166.0
                                                              7.0 186.7 177.8 408.8
                                                                                  6639.0
                                                                                              9.0 0.0 1.05984
                                                                                                                        173.0 2
1 2009.0 233860164.0 134270200.0 1.031655 1.02732 22.5 1.6 173.0 20.0 146.6 127.0
                                                                                              9.0 0.0 1.05984
                                                                                                                        193.0 1
                                                                              40.9
                                                                                    318.0
2 2009.0 233860164.0 134270200.0 1.031655 1.02732 27.7
                                                                                                                        184.0 1
                                                   2.6 176.0
                                                              8.0 139.7 132.8
                                                                              80.1
                                                                                    309.0
                                                                                              9.0 0.0 1.05984
3 2009.0 233860164.0 134270200.0 1.031655 1.02732 32.8
                                                   5.4 167.0
                                                              8.0 150.5 142.5 154.3
                                                                                    304.0
                                                                                              9.0
                                                                                                  0.0 1.05984
                                                                                                                        175.0 1
4 2009.0 233860164.0 134270200.0 1.031655 1.02732 37.5 10.0 166.0 7.0 174.6 165.8 334.9
                                                                                                                        173.0 2
                                                                                    298.0
                                                                                              9.0 0.0 1.05984
In [79]:
y = female_data['実質産出']
In [80]:
feature = female data.loc[:,['勤続年数','勤続年数2乘','education','実際中间投入','ckb','total working time']]
In [81]:
feature = sm.add_constant(feature)
```

```
In [83]:
```

res.summary()

Out[83]:

OLS Regression Results

| 0.947 | R-squared: | 実質産出 | Dep. Variable: |
|-----------|---------------------|------------------|-------------------|
| 0.946 | Adj. R-squared: | OLS | Model: |
| 1043. | F-statistic: | Least Squares | Method: |
| 3.36e-221 | Prob (F-statistic): | Wed, 01 Feb 2023 | Date: |
| 989.45 | Log-Likelihood: | 15:32:38 | Time: |
| -1965. | AIC: | 360 | No. Observations: |
| -1938. | BIC: | 353 | Df Residuals: |
| | | 6 | Df Model: |
| | | nonrobust | Covariance Type: |

| | coef | std err | t | P> t | [0.025 | 0.975] |
|--------------------|-----------|----------|--------|-------|-----------|----------|
| const | 0.8552 | 0.254 | 3.369 | 0.001 | 0.356 | 1.355 |
| 勤続年数 | 0.0004 | 0.001 | 0.761 | 0.447 | -0.001 | 0.002 |
| 勤続年数2乘 | -8.81e-06 | 2.01e-05 | -0.439 | 0.661 | -4.83e-05 | 3.07e-05 |
| education | 0.0005 | 0.000 | 1.215 | 0.225 | -0.000 | 0.001 |
| 実際中间投入 | 0.9640 | 0.015 | 66.458 | 0.000 | 0.936 | 0.993 |
| ckb | 0.2934 | 0.023 | 12.495 | 0.000 | 0.247 | 0.340 |
| total_working_time | 0.0004 | 0.000 | 1.806 | 0.072 | -3.38e-05 | 0.001 |

 Omnibus:
 48.381
 Durbin-Watson:
 0.050

 Prob(Omnibus):
 0.000
 Jarque-Bera (JB):
 64.803

 Skew:
 1.029
 Prob(JB):
 8.47e-15

 Kurtosis:
 3.287
 Cond. No.
 9.08e+04

Notes:

- [1] Standard Errors assume that the covariance matrix of the errors is correctly specified.
- [2] The condition number is large, 9.08e+04. This might indicate that there are strong multicollinearity or other numerical problems.

男性モデル

```
log(y(t)) = C + + Q1*exp + Q2*exp_square + Q3*edu + Q4*log(ME(t)) + Q5*log(CKB(t)) + Q6*Full + u y: 実質産出 exp:勤続年数 exp_square:勤続年数2乗 edu:教育年数 ME(t): 実際中間投入(t年での条件) CKB(t): 資本サービス投入指数 * 実質資本ストック指数(t年での条件) Full: 总劳动时间
```

```
In [84]:
male data.head()
Out[84]:
                                                                                                                                                                                                                                                                                     きま
                                                                                                                                                                                                                                                                                                                                   年間
                                                                                                                                                                                                                                                                                                                                   賞与
                                                                                                                                                                                                                                            所定
                                                                                                                                                                                                                                                                                                            所定
                                                                                                                                                                                                                                                                    実労
                                                                                                                                                                                                                                                                                     支給
                                                                                                                                                                                                                                                                                                                                    その
                                                                                                                                   資本サー
                                                                                                                                                                                                                                                                                                            内給
                                                                                                                                                                                                                                                                                      する
                                                                                                                                                                                                                                                                                                                                   他特
                                                                                                                                                                                                                                                                                                                                                          労働者
                                                          出荷额
                                                                                                 中间投入
                                                                                                                                 ビス投入
                                                                                                                                                                                                                                                                                                            与額
                                                                                                                                                                                                                                                                                                                                                                                    education sex
                                                                                                                                                                                                                                                                                                                                                                                                                                                       ckb total_working_time
                                                                                                                                                                                                                                                                    働
                                                                                                                                                                                                                                                                                     現金
                                                                                                                                                                                                                                                                                                                                                     数(十人)
                                                                                                                                                                         ック指
                                                                                                                                                                                                                                                                                                                                   別給
                                                                                                                                                                                                                                                                    時
                                                                                                                                                                                                                                                                                     給与
                                                                                                                                                                                                                                                                                                                                   与額
                                                                                                                                                                                                                                                                    間
                                                                                                                                                                                                                                                                                   額(千
                                                                                                                                                                                                                                                                                                                                       (Ŧ
                                                                                                                                                                                                                                                                                                                                       円)
                                                                                                                                                                                                                                                                     数
   0 \quad 2009.0 \quad 233860164.0 \quad 134270200.0 \quad 1.031655 \quad 1.02732 \quad 50.1 \quad 22.1 \quad 164.0 \quad 12.0 \quad 318.0 \quad 290.8 \quad 920.1 \quad 22719.0 \quad 200.0 
                                                                                                                                                                                                                                                                                                                                                                                                           9.0 1.0 1.05984
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                      176.0
  1 2009.0 233860164.0 134270200.0 1.031655 1.02732 22.7 2.5 168.0 34.0 222.0 180.8 313.8
                                                                                                                                                                                                                                                                                                                                                             852.0
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                    202.0
                                                                                                                                                                                                                                                                                                                                                                                                          9.0 1.0 1.05984
  2 2009.0 233860164.0 134270200.0 1.031655 1.02732 27.5 5.3 165.0 16.0 241.6 212.1 543.2
                                                                                                                                                                                                                                                                                                                                                          1081.0
                                                                                                                                                                                                                                                                                                                                                                                                           9.0 1.0 1.05984
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                      181.0
  3 2009.0 233860164.0 134270200.0 1.031655 1.02732 32.7 8.3 167.0 16.0 263.5 232.3 646.3
                                                                                                                                                                                                                                                                                                                                                          1208.0
                                                                                                                                                                                                                                                                                                                                                                                                           9.0 1.0 1.05984
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                      183.0
  4 2009.0 233860164.0 134270200.0 1.031655 1.02732 37.3 11.6 166.0 16.0 295.9 261.1 753.3
                                                                                                                                                                                                                                                                                                                                                          1814.0
                                                                                                                                                                                                                                                                                                                                                                                                           9.0 1.0 1.05984
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                      182.0
In [85]:
y = male_data['実質産出']
In [86]:
feature = female data.loc[:,['勤続年数','勤続年数2乘','education','実際中间投入','ckb','total working time']]
In [87]:
feature = sm.add_constant(feature)
In [88]:
```

res = sm.OLS(y,feature).fit()

In [89]:

res.summary()

Out[89]:

OLS Regression Results

| Dep. Variable: | 実! | 質産出 | | R-sq | uared: | 0.947 | |
|-----------------------------|---|-------------------------|----------------------|-----------------------------------|----------------------------------|--|-------------------------------------|
| Model: | | OLS | Ac | dj. R-sq | uared: | 0.946 | |
| Method: | Least So | quares | | F-sta | itistic: | 1043. | |
| Date: | Wed, 01 Feb | 2023 | Pro | b (F-sta | tistic): | 3.36e-221 | |
| Time: | 15 | :34:45 | Lo | g-Likel | ihood: | 989.45 | |
| No. Observations: | | 360 | | | AIC: | -1965. | |
| Df Residuals: | | 353 | | | BIC: | -1938. | |
| Df Model: | | 6 | | | | | |
| Covariance Type: | nonrobust | | | | | | |
| | | | | | | | |
| | coef | std e | rr | t | P> t | [0.025 | 0.975] |
| const | coef 0.8552 | std e | | t 3.369 | P> t 0.001 | [0.025 0.356 | 0.975] 1.355 |
| const 勤続年数 | | | 54 | | • • • | - | - |
| | 0.8552 0.0004 | 0.25 | 54 01 | 3.369 0.761 | 0.001 | 0.356 | 1.355 |
| 勤続年数 | 0.8552 0.0004 | 0.25 | 54 01 05 | 3.369 0.761 | 0.001 | 0.356 | 1.355 |
| 勤続年数 勤続年数2乘 | 0.8552 0.0004 -8.81e-06 0.0005 | 0.25 0.00 2.01e-0 | 54 01 05 00 | 3.369 0.761 -0.439 | 0.001 0.447 0.661 | 0.356 -0.001 -4.83e-05 | 1.355 0.002 3.07e-05 |
| 勤続年数 勤続年数2乘 education | 0.8552 0.0004 -8.81e-06 0.0005 | 0.25 0.00 2.01e-0 | 54 01 05 00 | 3.369 0.761 -0.439 1.215 | 0.001 0.447 0.661 0.225 | 0.356 -0.001 -4.83e-05 -0.000 | 1.355 0.002 3.07e-05 0.001 |

 Omnibus:
 48.381
 Durbin-Watson:
 0.050

 Prob(Omnibus):
 0.000
 Jarque-Bera (JB):
 64.803

 Skew:
 1.029
 Prob(JB):
 8.47e-15

 Kurtosis:
 3.287
 Cond. No.
 9.08e+04

Notes:

- [1] Standard Errors assume that the covariance matrix of the errors is correctly specified.
- [2] The condition number is large, 9.08e+04. This might indicate that there are strong multicollinearity or other numerical problems.

In []: