# **AAEC 6950 HW2 Q3**

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#### Set wd, libraries

```
setwd("C:\\Users\\Will Underwood\\OneDrive\\Documents\\AAEC 6960\\HW2 Q3")
library(dplyr)
## Attaching package: 'dplyr'
## The following objects are masked from 'package:stats':
##
##
       filter, lag
##
   The following objects are masked from 'package:base':
##
       intersect, setdiff, setequal, union
library(tidyverse)
## — Attaching core tidyverse packages -
                                                                  — tidyverse 2.0.0 —
## ✓ forcats
              1.0.0
                         ✓ readr
                                       2.1.5
## ✓ ggplot2 3.5.1
                                       1.5.1

✓ strinar

## ✔ lubridate 1.9.3

✓ tibble

                                       3.2.1
## ✔ purrr
               1.0.2

✓ tidyr

                                       1.3.1
## — Conflicts -
                                                             — tidyverse_conflicts() —
## * dplyr::filter() masks stats::filter()
## * dplvr::lag()
                    masks stats::lag()
## i Use the conflicted package (<a href="http://conflicted.r-lib.org/">http://conflicted.r-lib.org/</a>) to force all conflicts to become errors
library(tidyr)
```

# **Data Cleaning**

### **Import Data**

```
cereals0508 = read_csv("TradeData_9_24_2024_9_17_39.csv")

## Warning: One or more parsing issues, call `problems()` on your data frame for details,
## e.g.:
## dat <- vroom(...)
## problems(dat)</pre>
```

```
## Rows: 14489 Columns: 47
## — Column specification
## Delimiter: ","
## chr (19): typeCode, freqCode, reporterISO, reporterDesc, flowCode, flowDesc,...
## dbl (21): refPeriodId, refYear, refMonth, period, reporterCode, partnerCode,...
## lgl (7): isOriginalClassification, isLeaf, isQtyEstimated, isAltQtyEstimate...
##
## i Use `spec()` to retrieve the full column specification for this data.
## i Specify the column types or set `show_col_types = FALSE` to quiet this message.
```

```
cereals0920 = read_csv("TradeData_9_24_2024_9_19_36.csv")
```

```
## Warning: One or more parsing issues, call `problems()` on your data frame for details,
## e.g.:
## dat <- vroom(...)
## problems(dat)</pre>
```

```
## Rows: 4156 Columns: 47
## — Column specification
## Delimiter: ","
## chr (19): typeCode, freqCode, reporterISO, reporterDesc, flowCode, flowDesc,...
## dbl (21): refPeriodId, refYear, refMonth, period, reporterCode, partnerCode,...
## lgl (7): isOriginalClassification, isLeaf, isQtyEstimated, isAltQtyEstimate...
\#\# i Use `spec()` to retrieve the full column specification for this data.
## i Specify the column types or set `show col types = FALSE` to quiet this message.
gdpPHW = read_csv("productivity.csv")
## Rows: 618 Columns: 26
## — Column specification
## Delimiter: ","
## chr (15): STRUCTURE, STRUCTURE ID, STRUCTURE NAME, ACTION, LOCATION, Country...
## dbl (2): TIME PERIOD, OBS VALUE
## lgl (9): Time, Observation Value, Observation Status, UNIT_MEASURE, Unit of...
## i Use `spec()` to retrieve the full column specification for this data.
## i Specify the column types or set `show_col_types = FALSE` to quiet this message.
laborForce = read_csv("laborForce.csv")
## Rows: 43 Columns: 20
## — Column specification -
## Delimiter: ","
## chr (4): Series Name, Series Code, Country Name, Country Code
## dbl (16): 2005, 2006, 2007, 2008, 2009, 2010, 2011, 2012, 2013, 2014, 2015, ...
## i Use `spec()` to retrieve the full column specification for this data.
## i Specify the column types or set `show_col_types = FALSE` to quiet this message.
capitalFM = read csv("capitalFormation.csv", na = "..")
## Warning: One or more parsing issues, call `problems()` on your data frame for details,
## e.g.:
##
    dat <- vroom(...)
    problems(dat)
## Rows: 233 Columns: 20
## — Column specification
## Delimiter: ","
## chr (4): Series Name, Series Code, Country Name, Country Code
## dbl (16): 2005, 2006, 2007, 2008, 2009, 2010, 2011, 2012, 2013, 2014, 2015, ...
##
## i Use `spec()` to retrieve the full column specification for this data.
## i Specify the column types or set `show_col_types = FALSE` to quiet this message.
elevUnder5 = read csv("elevationData.csv", skip = 4)
## New names:
## Rows: 266 Columns: 69
## — Column specification
                                                           – Delimiter: "," chr
## (4): Country Name, Country Code, Indicator Name, Indicator Code dbl (3): 1990,
## 2000, 2015 lgl (62): 1960, 1961, 1962, 1963, 1964, 1965, 1966, 1967, 1968,
## 1969, 1970, ...
## i Use `spec()` to retrieve the full column specification for this data. i
## Specify the column types or set `show_col_types = FALSE` to quiet this message.
## • `` -> `...69`
```

#### get full cereal data

```
cerials0520 = rbind(cereals0508, cereals0920)
```

```
gdpPHW = gdpPHW %>% rename(period = TIME_PERIOD, reporterISO = LOCATION, gdpPerHr = OBS_VALUE)
gdpPHW = gdpPHW %>% select(c("period","reporterISO","gdpPerHr"))
```

#### join gdpPHW to cereal data

```
intrCer1 = cerials0520 %>% left_join(gdpPHW, by = c("reporterISO"="reporterISO", "period" = "period"))
intrCer3 = intrCer1 %>% left_join(gdpPHW, by = c("partnerISO"="reporterISO", "period" = "period"))
intrCer3 = intrCer3 %>% rename(PgdpPH = gdpPerHr.y)
intrCer3 = intrCer3 %>% rename(gdpPerHr = gdpPerHr.x)
```

#### prepare capitalFM for pivot

```
capitalFM = select(capitalFM, !c('Series Name', 'Series Code', 'Country Name'))
capitalFM = capitalFM %>% rename(reporterISO = Country Code)
```

#### **Pivot**

```
capitalFMlong = capitalFM %>%
  pivot_longer(
    !reporterISO,
    names_to = "period",
    values_to = "capForm"
)
```

#### make year values numeric

```
capitalFMlong$period = as.double(capitalFMlong$period)
```

### check for and remove duplicate rows in capitalFMlong

```
capitalFMlong %>%
  count(reporterISO, period) %>%
  filter(n>1)
```

```
## # A tibble: 624 × 3
     reporterISO period
##
                  <dbl> <int>
## 1 ""
                   2005
                           5
   2 ""
##
                   2006
                            5
   3 ""
##
                   2007
## 4 ""
                   2008
## 5 ""
                   2009
## 6 ""
                   2010
## 7 ""
                   2011
                            5
  8 ""
##
                   2012
                            5
##
   9 ""
                   2013
                            5
## 10 ""
                   2014
                            5
## # i 614 more rows
```

```
capitalFMlong = capitalFMlong %>%
  group_by(reporterISO, period) %>%
  summarise(capForm = first(capForm), .groups = 'drop')
```

## Merge intermediate cereal 3 with capitalFMlong

```
intrCer2 = intrCer3 %>% left_join(capitalFMlong, by = c("reporterISO","period"))
intrCer4 = intrCer2 %>% left_join(capitalFMlong, by = c("partnerISO"= "reporterISO", "period" = "period"))
intrCer4 = intrCer4 %>% rename(capForm = capForm.x)
intrCer4 = intrCer4 %>% rename(PcapForm = capForm.y)
```

## prepare laborForce for pivot

```
laborForce = laborForce %>% select(!c("Series Name","Series Code", "Country Name"))
laborForce = laborForce %>% rename("reporterISO" = "Country Code")
```

```
laborForceLong = laborForce %>%
pivot_longer(
  !reporterISO,
  names_to = "period",
  values_to = "labForce"
)
```

#### make year numeric

```
laborForceLong$period = as.numeric(laborForceLong$period)
```

### merge intermediate cereal 4 with laborForce

```
intrCer5 = intrCer4 %>% left_join(laborForceLong, by = c("reporterISO", "period"))
q3data = intrCer5 %>% left_join(laborForceLong, by = c("partnerISO"= "reporterISO", "period"))
q3data = q3data %>% rename(labForce = labForce.x)
q3data = q3data %>% rename(PlabForce = labForce.y)
q3data = q3data %>% rename(exports = primaryValue)
```

### create tech ratio & capital intensity ratio vars, log(those) & log(exports)

### elevation cleaning

```
elevUnder5 = elevUnder5 %>% select(c("Country Code", "2015"))
elevUnder5 = elevUnder5 %>% rename("elevU5" = "2015")
```

```
q3data = q3data %>% left_join(elevUnder5, by = c("reporterISO" = "Country Code"))
q3data = q3data %>% left_join(elevUnder5, by = c("partnerISO" = "Country Code"))
q3data = q3data %>% rename("elevU5"= "elevU5.x", "PelevU5" = "elevU5.y")
```

### remove na & self-trading

```
q3data = na.omit(q3data) #omitted rows: partner country is non-oecd, thus not in labor, capital, or tech data q3data = q3data %>% filter(reporterISO != partnerISO)
```

## Q3.a.

i

#### summarize

```
q3dataX = filter(q3data, flowCode == "X")
summary(q3dataX)
```

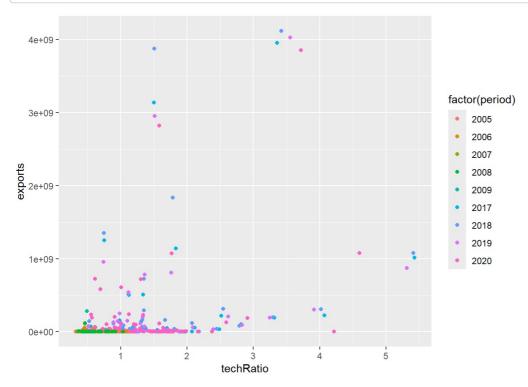
```
typeCode
                      freqCode
                                       refPeriodId
                                                           refYear
##
   Length:442
                     Length:442
                                       Min. :20050101 Min.
                                                              :2005
##
   Class :character Class :character
                                      1st Qu.:20090101
                                                        1st Qu.:2009
##
   Mode :character Mode :character
                                      Median :20180101
                                                        Median :2018
##
                                       Mean : 20153155
                                                        Mean : 2015
##
                                       3rd Qu.:20200101
                                                        3rd Qu.:2020
##
                                       Max. :20200101
                                                        Max. :2020
                  period
##
      refMonth
                              reporterCode reporterISO
## Min. :52 Min. :2005 Min. :124.0 Length:442
              1st Qu.:2009
   1st Qu.:52
                             1st Qu.:348.0
##
                                           Class :character
##
   Median :52
               Median :2018
                             Median :616.0
                                            Mode :character
##
   Mean :52
               Mean :2015
                             Mean :562.9
   3rd Qu.:52
              3rd Qu.:2020
                            3rd Ou.:842.0
##
```

```
:2020 Max.
   Max. :52 Max.
                                    :842.0
   reporterDesc
                       flowCode
                                         flowDesc
                                                          partnerCode
##
   Length:442
                     Length:442
                                       Length:442
                                                         Min. : 36.0
##
   Class :character
                     Class :character
                                       Class :character
                                                         1st Ou.:233.0
##
   Mode :character
                     Mode :character
                                       Mode :character
                                                         Median :380.0
##
                                                         Mean :420.7
                                                         3rd Qu.:620.0
##
##
                                                         Max. :842.0
##
    partnerIS0
                     partnerDesc
                                        partner2Code partner2ISO
##
   Length:442
                     Length:442
                                       Min. :0 Length:442
   Class :character
##
                     Class :character
                                       1st Qu.:0
                                                    Class :character
##
   Mode :character
                     Mode :character
                                       Median :0
                                                    Mode :character
##
                                       Mean :0
##
                                       3rd Qu.:0
##
                                       Max. :0
##
   partner2Desc
                     classificationCode classificationSearchCode
##
   Length:442
                     Length:442
                                       Length:442
    Class :character
                     Class :character
                                       Class :character
   Mode :character Mode :character Mode :character
##
##
##
##
##
                            cmdCode
   isOriginalClassification
                                        cmdDesc
                                                           aggrLevel
##
   Mode:logical
                          Min. :10
                                       Length:442
                                                         Min. :2
##
   TRUE: 442
                           1st Qu.:10
                                       Class :character
                                                         1st Ou.:2
                                       Mode :character
##
                           Median :10
                                                         Median :2
##
                           Mean :10
                                                         Mean :2
                                                         3rd Qu.:2
##
                           3rd Qu.:10
##
                           Max. :10
                                                         Max.
##
                  customsCode
                                    customsDesc
                                                         mosCode
     isLeaf
                                                                    motCode
##
   Mode :logical
                  Length:442
                                    Length:442
                                                      Min. :0
                                                                 Min. :0
                  Class :character
##
   FALSE:442
                                    Class :character
                                                      1st Qu.:0
                                                                 1st Ou.:0
                  Mode :character Mode :character
##
                                                                Median :0
                                                      Median :0
##
                                                      Mean :0
                                                                Mean :0
##
                                                      3rd Qu.:0
                                                                3rd Qu.:0
##
                                                      Max. :0
                                                                 Max. :0
##
     motDesc
                      qtyUnitCode qtyUnitAbbr
                                                              isQtyEstimated
                                                        qty
##
   Lenath: 442
                     Min. :-1 Length:442
                                                   Min. :0
                                                              Mode :logical
##
   Class :character
                     1st Qu.:-1
                                 Class :character
                                                   1st Qu.:0
                                                              FALSE:442
##
   Mode :character
                     Median :-1
                                 Mode :character
                                                   Median :0
##
                     Mean :-1
                                                    Mean :0
                                                    3rd Qu.:0
##
                     3rd Qu.:-1
##
                     Max. :-1
                                                   Max. :0
##
   altQtyUnitCode altQtyUnitAbbr
                                      altQty isAltQtyEstimated
                                                                   netWgt
##
   Min. :-1
                 Length:442
                                   Min. :0
                                               Mode :logical
                                                               Min. :0
                                   1st Qu.:0
   1st Ou.:-1
                                                               1st Ou.:0
##
                 Class :character
                                               FALSE: 442
   Median :-1
                 Mode :character
                                   Median :0
                                                               Median :0
##
##
                                   Mean :0
   Mean :-1
                                                               Mean :0
   3rd Qu.:-1
                                                                3rd Qu.:0
##
                                   3rd Qu.:0
##
   Max. :-1
                                   Max. :0
                                                                Max. :0
   isNetWgtEstimated grossWgt isGrossWgtEstimated cifvalue
##
##
   Mode :logical
                 Min. :0 Mode:logical
                                                  Min. :0
                    1st Qu.:0
##
   FALSE:390
                               FALSE: 442
                                                  1st Ou.:0
##
   TRUE :52
                    Median :0
                                                  Median :0
##
                    Mean :0
                                                  Mean
##
                    3rd Qu.:0
                                                   3rd Qu.:0
##
                    Max. :0
                                                  Max. :0
      fobvalue
                                         legacyEstimationFlag isReported
##
                        exports
   Min. :2.000e+00
                                         Min. :0.0000
##
                      Min. :2.000e+00
                                                             Mode :logical
##
   1st Ou.:2.823e+05
                     1st Ou.:2.823e+05
                                         1st Ou.:0.0000
                                                             FALSE: 442
   Median :2.382e+06 Median :2.382e+06
                                         Median :0.0000
##
   Mean :1.315e+08 Mean :1.315e+08 Mean :0.4706
                      3rd Qu.:3.231e+07
   3rd Qu.:3.231e+07
##
                                         3rd Qu.:0.0000
                                        Max. :4.0000
##
   Max. :4.115e+09
                      Max. :4.115e+09
                      gdpPerHr
##
   isAggregate
                                        PgdpPH
                                                    capForm
                                    Min. : 12.86 Min. :1.011e+11
##
                     Min. :26.73
   Lenath:442
   Class :character
                     1st Qu.:29.32    1st Qu.: 39.89    1st Qu.:3.145e+11
##
   Mode :character
                     Median :52.47 Median : 52.76 Median :1.326e+12
##
                     Mean :50.72 Mean : 53.08 Mean :5.650e+12
                                                   3rd Qu.:1.558e+13
Max. :1.634e+13
##
                     3rd Qu.:69.88
                                    3rd Qu.: 66.88
##
                     Max. :73.96
                                    Max. :120.84
##
      PcapForm
                      labForce
                                           PlabForce
                                                             techRatio
   Min. :1.198e+10
                    Min. : 4724407
                                       Min. : 175622 Min. :0.3179
##
   1st Qu.:1.478e+11
                     1st Qu.: 17594853    1st Qu.: 2760886    1st Qu.:0.6122
##
   Median: 2.674e+11 Median: 20348244 Median: 5167188 Median: 0.9426
##
   Mean :1.009e+12 Mean : 66521843
                                        Mean : 17178237
                                                            Mean :1.1267
##
   3rd Qu.:1.018e+12
                      3rd Qu.:163971527
                                         3rd Qu.: 24586422
                                                            3rd Qu.:1.3465
   Max. :1.634e+13 Max. :167100511
                                         Max. :167100511
##
                                                            Max. :5.4326
##
       capInt
                     PcapInt
                                capIntRatio
                                                   LtechRatio
```

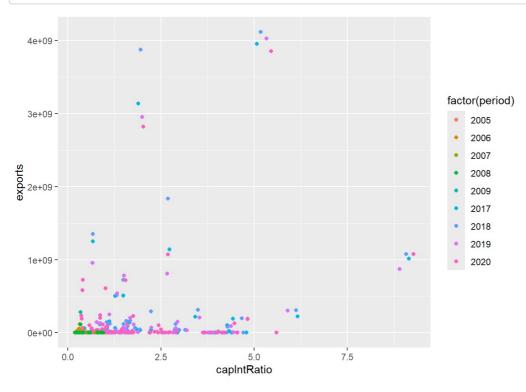
```
##
    Min.
           :15279
                    Min.
                            :10392
                                     Min.
                                            :0.1801
                                                              :-1.14612
    1st Qu.:18230
                    1st Qu.:26536
                                     1st Qu.:0.3774
                                                      1st Qu.:-0.49064
##
    Median :58584
                    Median :57531
                                     Median :0.9646
                                                      Median :-0.05907
           :54316
                           :51331
                                            :1.4463
                                                             :-0.04940
##
    Mean
                    Mean
                                     Mean
                                                      Mean
##
    3rd Qu.:95015
                    3rd Qu.:67319
                                     3rd Qu.:1.6753
                                                      3rd Qu.: 0.29753
##
    Max.
           :97806
                    Max.
                           :98736
                                     Max.
                                            :9.2751
                                                      Max.
                                                              : 1.69243
##
                                              elevU5
                                                             PelevU5
    LcapIntRatio
                          Lexports
                              : 0.6931
                                                 :0.000
                                                                 : 0.000
##
    Min.
          :-1.71399
                       Min.
                                          Min.
                                                          Min.
##
    1st Qu.:-0.97440
                       1st Qu.:12.5508
                                          1st Qu.:1.060
                                                          1st Qu.: 0.697
##
    Median :-0.03606
                       Median :14.6833
                                          Median :1.060
                                                          Median : 1.599
##
    Mean
         :-0.06851
                       Mean
                              :14.6769
                                          Mean
                                                :1.229
                                                          Mean : 3.884
##
   3rd Qu.: 0.51601
                       3rd Qu.:17.2908
                                          3rd Qu.:1.455
                                                          3rd Qu.: 3.282
   Max.
         : 2.22733
                              :22.1380
                                                 :3.312
                                                                  :52.008
                       Max.
                                          Max.
                                                          Max.
```

#### visualize

```
ggplot(data= q3dataX) +
  geom_point(aes(techRatio, exports, color = factor(period)))
```



```
ggplot(data = q3dataX)+
  geom_point(aes(capIntRatio, exports, color = factor(period)))
```



```
Loglog = lm(Lexports ~ LtechRatio + LcapIntRatio, data = q3dataX)
Linlog = lm(exports ~ LtechRatio + LcapIntRatio, data = q3dataX)
Linlin = lm(exports ~ techRatio + capIntRatio, data = q3dataX)
summary(Loglog)
```

```
##
## Call:
## lm(formula = Lexports ~ LtechRatio + LcapIntRatio, data = q3dataX)
##
## Residuals:
##
       Min
                 10
                      Median
                                   30
                                           Max
## -13.9913 -2.0266
                      0.2869
                               2.3732
                                        6.8912
##
## Coefficients:
               Estimate Std. Error t value Pr(>|t|)
##
## (Intercept)
               14.7685
                            0.1590 92.873 < 2e-16 ***
                 -0.2094
                            0.7763 -0.270 0.78752
## LtechRatio
                                    3.242 0.00128 **
## LcapIntRatio
                1.4880
                            0.4591
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 3.329 on 439 degrees of freedom
## Multiple R-squared: 0.1327, Adjusted R-squared: 0.1288
## F-statistic: 33.59 on 2 and 439 DF, p-value: 2.658e-14
```

#### summary(Linlog)

```
##
## Call:
## lm(formula = exports ~ LtechRatio + LcapIntRatio, data = q3dataX)
## Residuals:
##
                            Median
                                           30
         Min
                     10
                                                     Max
  -631441712 -182185679 -79623775 32516436 3608946772
##
##
## Coefficients:
##
                 Estimate Std. Error t value Pr(>|t|)
                           23416348 6.274 8.45e-10 ***
## (Intercept)
                146912566
                                      4.262 2.48e-05 ***
                487208447
## LtechRatio
                           114312524
## LcapIntRatio -125748721 67598697 -1.860 0.0635 .
## --
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 490200000 on 439 degrees of freedom
## Multiple R-squared: 0.105, Adjusted R-squared: 0.1009
## F-statistic: 25.75 on 2 and 439 DF, p-value: 2.656e-11
```

#### summary(Linlin)

```
##
## Call:
## lm(formula = exports ~ techRatio + capIntRatio, data = q3dataX)
##
## Residuals:
##
                            Median
                     10
                                           30
  -1.025e+09 -1.520e+08 -5.040e+07 3.622e+07 3.630e+09
##
##
## Coefficients:
##
                Estimate Std. Error t value Pr(>|t|)
                           46431394 -4.293 2.17e-05 ***
## (Intercept) -199323769
## techRatio
               390200783
                           78221502
                                      4.988 8.79e-07 ***
## capIntRatio -75279392
                           40608367 -1.854
                                             0.0644 .
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 477600000 on 439 degrees of freedom
## Multiple R-squared: 0.1505, Adjusted R-squared: 0.1466
## F-statistic: 38.89 on 2 and 439 DF, p-value: 2.832e-16
```

## Q3.d

```
Linlin2 = lm(exports ~ techRatio + capIntRatio + elevU5 , data = q3dataX)
summary(Linlin2)
```

```
##
## Call:
## lm(formula = exports ~ techRatio + capIntRatio + elevU5, data = q3dataX)
## Residuals:
##
        Min
                10
                        Median
                                         3Q
                                                  Max
## -971231774 -140098209 -52655639 33026484 3635210282
##
## Coefficients:
##
               Estimate Std. Error t value Pr(>|t|)
## (Intercept) -161593311 55909123 -2.890 0.00404 **
## techRatio 401004354 78688317 5.096 5.17e-07 ***
## capIntRatio -76579850 40601138 -1.886 0.05994 .
            -39077500 32293856 -1.210 0.22691
## elevU5
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 477300000 on 438 degrees of freedom
## Multiple R-squared: 0.1533, Adjusted R-squared: 0.1475
## F-statistic: 26.44 on 3 and 438 DF, p-value: 9.809e-16
```