## regs

## March 31, 2024

```
[]: import polars as pl
    import statsmodels.formula.api as smf
    import numpy as np
    from stargazer.stargazer import Stargazer
[]: df = pl.read_parquet("../data/combined_all.parquet")
    pd_df = df.to_pandas()
[]: pd_df["arwu_ranked_num"] = pd_df["arwu_ranked_num"] / pd_df["population"] *__
     →1 000 000
    pd_df["gdp_pc_growth"] = 100 * pd_df["gdp_pc_growth"]
     # pd_df["qdp_pc"] = np.log(pd_df["qdp_pc"])
     # pd_df["population"] = np.log(pd_df["population"])
[]: pisa_no_fix = smf.ols("gdp_pc_growth ~ gdp_pc + imo_total_score + math +__
      →in_math99 + arwu_ranked_num*gdp_pc + primary_completion +

      Glower_sec_completion + upper_sec_completion + population + democracy_eiu",□
      pd_df[pd_df["year"].isin([2003, 2006, 2009, 2012, 2015, 2018])]).fit()
    pisa = smf.ols("gdp pc growth ~ gdp pc + imo total score + math + in math99 +11
      →arwu_ranked_num*gdp_pc + primary_completion + lower_sec_completion + ⊔
      →upper_sec_completion + population + democracy_eiu + C(year) ",□

¬pd_df[pd_df["year"].isin([2003, 2006, 2009, 2012, 2015, 2018])]).fit()
    pisa_country = smf.ols("gdp_pc_growth ~ gdp_pc + imo_total_score + math +__
      →in_math99 + arwu_ranked_num*gdp_pc + primary_completion +

      \hookrightarrowlower_sec_completion + upper_sec_completion + population + democracy_eiu +_{\sqcup}
      Gountry", pd_df[pd_df["year"].isin([2003, 2006, 2009, 2012, 2015, 2018])]).
      →fit()
    pisa_no_score = smf.ols("gdp_pc_growth ~ gdp_pc + imo_total_score +_u
      ⇔arwu_ranked_num*gdp_pc + primary_completion + lower_sec_completion + ⊔
      →upper_sec_completion + population + democracy_eiu + C(year) ",□
      →pd_df[pd_df["year"].isin([2003, 2006, 2009, 2012, 2015, 2018]) &□
      pisa_all_no_interac = smf.ols("gdp_pc_growth ~ gdp_pc + imo_total_score + math_
      →+ read + science + in math99 + arwu ranked num + primary completion +,,
      ⇔lower_sec_completion + upper_sec_completion + population + democracy_eiu + ⊔
      G(year) ", pd_df[pd_df["year"].isin([2003, 2006, 2009, 2012, 2015, 2018])]).
      ⊶fit()
```

```
pisa_all = smf.ols("gdp_pc_growth ~ gdp_pc + imo_total_score + math + read +_\infty
      ⇔science + in_math99 + arwu_ranked_num*gdp_pc + primary_completion +⊔
      →lower_sec_completion + upper_sec_completion + population + democracy_eiu + LI
      →fit()
    non pisa = smf.ols("gdp pc growth ~ gdp pc + democracy eiu + imo total score +11
      →arwu_ranked_num*gdp_pc + primary_completion + lower_sec_completion + ⊔
      →upper_sec_completion + population + C(year) ", pd_df).fit()
    non_pisa_country = smf.ols("gdp_pc_growth ~ gdp_pc + democracy_eiu +__
      ⇔imo_total_score + arwu_ranked_num*gdp_pc + primary_completion +□
      ⇔lower_sec_completion + upper_sec_completion + population + C(year) + ∪

country", pd df).fit()

    non_pisa_no_interac = smf.ols("gdp_pc_growth ~ gdp_pc + democracy_eiu +__
      oimo_total_score + arwu_ranked_num + primary_completion + →
      □lower_sec_completion + upper_sec_completion + population + C(year) ", pd_df).
      →fit()
[]: pisa_sg = Stargazer([pisa_no_score, pisa_no_fix, pisa, pisa_country])
[]: pisa_sg.covariate_order(["in_math99", "imo_total_score", "arwu_ranked_num", __

¬"arwu_ranked_num:gdp_pc", "math", "gdp_pc", "primary_completion",
□

¬"lower_sec_completion", "upper_sec_completion"])
    pisa_sg.add_line('Time Effects', ['Yes', 'No', 'Yes', 'No'])
    pisa_sg.add_line('Fixed Effects', ['No', 'No', 'No', 'Yes'])
    pisa_sg.add_line('Entities', [48, 48, 48, 48])
    pisa_sg
[]: <stargazer.stargazer.Stargazer at 0x32a1605c0>
[]: non_pisa_sg = Stargazer([non_pisa_no_interac, non_pisa, non_pisa_country])
    non_pisa_sg.covariate_order(["imo_total_score", "arwu_ranked_num",_

¬"arwu_ranked_num:gdp_pc", "gdp_pc", "primary_completion",
□

¬"lower_sec_completion", "upper_sec_completion"])
    non_pisa_sg.add_line('Time Effects', ['Yes', 'Yes'])
    non_pisa_sg.add_line('Fixed Effects', ['No', 'No', 'Yes'])
    non_pisa_sg.add_line('Entities', [137, 137, 137])
    non_pisa_sg
[]: <stargazer.stargazer.Stargazer at 0x32a162240>
[]: group1 = pd_df[(pd_df["arwu_ranked_num"].notnull()) & (pd_df["math"].notnull())__
      →& (pd_df["imo_total_score"].notnull()) & (pd_df["primary_completion"].
      onotnull()) & (pd_df["lower_sec_completion"].notnull()) & ∟
      → (pd_df["upper_sec_completion"].notnull()) & (pd_df["democracy_eiu"].
      →notnull())]
    group1.shape
```

```
[]: (109, 16)
[]: group2 = pd_df[(pd_df["gdp_pc"].notnull()) & (pd_df["arwu_ranked_num"].
      onotnull()) & (pd_df["imo_total_score"].notnull()) & ∟
      → (pd_df["primary_completion"].notnull()) & (pd_df["lower_sec_completion"].
      onotnull()) & (pd_df["upper_sec_completion"].notnull()) & 
      group2.shape
[]: (746, 17)
     group1.describe()
[]:
                                      gdp_pc_growth
                                                    primary_completion
                   year
                              gdp_pc
     count
             109.000000
                         109.000000
                                         109.000000
                                                              109.000000
            2013.266055
                           9.774552
                                                               90.126140
    mean
                                           2.371332
     std
               4.068038
                            0.901493
                                           2.401491
                                                               10.448936
    min
            2006.000000
                                                               51.353222
                           7.360611
                                          -4.358317
     25%
            2012.000000
                                                               82.948372
                           9.118337
                                           0.875477
     50%
            2015.000000
                           9.788621
                                           2.105525
                                                               93.079300
                           10.563727
                                           3.933610
     75%
            2015.000000
                                                               98.932922
            2018.000000
                           11.493145
                                           9.142617
                                                              100.000000
     max
            lower_sec_completion
                                   upper_sec_completion
                                                         population
                      109.000000
                                                          109.000000
     count
                                             109.000000
                       74.816173
                                              58.464856
                                                           16.677068
     mean
                       19.717275
                                              21.212708
     std
                                                            1.516022
    min
                       31.719400
                                              22.409929
                                                           13.005949
     25%
                       57.490002
                                              39.669998
                                                           15.506307
     50%
                       78.459999
                                              57.732929
                                                           16.215255
     75%
                       93.785004
                                              77.846474
                                                           17.921958
                       99.816658
                                              97.399788
                                                           19.604976
    max
                                                                          science
            arwu_ranked_num
                              arwu_sum_score
                                                    math
                                                                 read
                 109.000000
                                  109.000000
                                              109.000000
                                                           107.000000
                                                                       109.000000
     count
                                                           458.898614
     mean
                  12.018349
                                   97.844037
                                              457.618259
                                                                       462.218945
     std
                  33.010375
                                  390.887652
                                               54.171813
                                                            46.089685
                                                                        49.296882
                                    0.000000
                                              327.250491
                                                                       334.946347
    min
                   0.000000
                                                           344.298016
     25%
                   0.00000
                                    0.000000
                                              412.679509
                                                           423.652913
                                                                       422.451115
                   2.000000
     50%
                                    0.000000
                                              473.142717
                                                           468.690188
                                                                       473.713287
     75%
                                    0.00000
                                                           497.643493
                   9.000000
                                              497.395753
                                                                       500.048433
                 217.000000
                                 2190.400000
                                                           548.583819
                                              568.359669
                                                                       548.876010
     max
             in math99
                        imo_total_score
                                          democracy_eiu
                                                          arwu_ranked_num_pc
            109.000000
                              109.000000
                                             109.000000
                                                                  109.000000
     count
    mean
              0.865194
                               76.944954
                                               7.299083
                                                                    0.248798
     std
              1.545727
                               55.338995
                                               1.335456
                                                                    0.319323
```

min	0.000000	0.000000	2.760000	0.000000
25%	0.028512	21.000000	6.550000	0.000000
50%	0.373039	82.000000	7.540000	0.056237
75%	1.041082	117.000000	8.130000	0.477434
max	9.501632	212.000000	9.930000	1.211386