11/15/21, 12:50 AM Datathon project

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```
import pandas as pd
import scipy as stats
from scipy.stats import linregress
import numpy as np
{\color{red} \textbf{import}} \ {\color{blue} \textbf{matplotlib.pyplot}} \ {\color{blue} \textbf{as}} \ {\color{blue} \textbf{plt}}
import wbgapi as wb
import seaborn as sns
```

wb.source.info()

id	name	lastupdated
1	Doing Business	2021-08-18
2	World Development Indicators	2021-10-28
3	Worldwide Governance Indicators	2021-09-27
5	Subnational Malnutrition Database	2016-03-21
6	International Debt Statistics	2021-10-10
11	Africa Development Indicators	2013-02-22
12	Education Statistics	2020-12-20
13	Enterprise Surveys	2021-04-02
14	Gender Statistics	2021-09-27
15	Global Economic Monitor	2020-07-27
16	Health Nutrition and Population Statistics	2021-09-15
18	IDA Results Measurement System	2021-07-23
19	Millennium Development Goals	2018-09-19
20	Quarterly Public Sector Debt	2021-11-01
22	Quarterly External Debt Statistics SDDS	2021-10-29
23	Quarterly External Debt Statistics GDDS	2021-10-29
24	Poverty and Equity	2021-10-05
25	Jobs	2021-02-17
27	Global Economic Prospects	2021-06-08
28	Global Financial Inclusion	2018-10-15

wb.series.info()

id	value
AG.AGR.TRAC.NO	Agricultural machinery, tractors
AG.CON.FERT.PT.ZS	Fertilizer consumption (% of fert
AG.CON.FERT.ZS	Fertilizer consumption (kilograms
AG.LND.AGRI.K2	Agricultural land (sq. km)
AG.LND.AGRI.ZS	Agricultural land (% of land area
AG.LND.ARBL.HA	Arable land (hectares)
AG.LND.ARBL.HA.PC	Arable land (hectares per person)
AG.LND.ARBL.ZS	Arable land (% of land area)
AG.LND.CREL.HA	Land under cereal production (hec
AG.LND.CROP.ZS	Permanent cropland (% of land are
AG.LND.EL5M.RU.K2	Rural land area where elevation i
AG.LND.EL5M.RU.ZS	Rural land area where elevation i
AG.LND.EL5M.UR.K2	Urban land area where elevation i
AG.LND.EL5M.UR.ZS	Urban land area where elevation i
AG.LND.EL5M.ZS	Land area where elevation is belo
AG.LND.FRST.K2	Forest area (sq. km)
AG.LND.FRST.ZS	Forest area (% of land area)
AG.LND.IRIG.AG.ZS	Agricultural irrigated land (% of
AG.LND.PRCP.MM	Average precipitation in depth (m
AG.LND.TOTL.K2	Land area (sq. km)

```
HCI_data = pd.read_csv('HCI.csv')
print(list(HCI_data.columns))
HCI_data
['Country Name', 'WB Code', 'Region', 'Income Group', 'Probability of Survival to Age 5', 'Expected Years of School', 'Harmonized Test Scores', 'Learn
     Country Name object WB Code object
                                            Region object
                                                                         Income Group object
                                                                                                 Probability of Surv... flo...
                                                                                                                             Expected Years of ... floa...
                                                                                                                                                          Harı
     Afghanistan ....... 0.6% AFG ................. 0.6%
                                           Europe & Central A.....27.6%
                                                                       High income ......32.8%
                                                                                                 0.88 - 1.0
                                                                                                                              4.2 - 13.9
                                                                                                                                                           305
     Albania ...... 0.6%
                          ALB ...
                                     .... 0.6%
                                            Sub-Saharan Africa ...... 24.1%
                                                                        Upper middle in... 27%
     172 others ......... 98.9% 172 others .98.9%
                                            5 others _____ 48.3%
                                                                        2 others ..... 40.2%
                                                                                                                                                           355
A
     Afghanistan
                          AFG
                                            South Asia
                                                                        Low income
                                                                                                 9.94
                                                                                                                              8.9
     Albania
                                            Europe & Central Asia
                                                                        Upper middle income
                                                                                                 0.99
                                                                                                                              12.9
                                                                                                                                                           434
1
                          ALB
                                            Middle East & North
2
     Algeria
                          DZA
                                                                         Lower middle income
                                                                                                 0.98
                                                                                                                              11.8
                                                                                                                                                           374
                                            Africa
                                            Sub-Saharan Africa
3
                          AGO
                                                                        Lower middle income
                                                                                                                                                           326
     Angola
                                                                                                 0.92
                                                                                                                              8.1
                                            Latin America &
     Antigua and
                          ATG
                                                                         High income
                                                                                                 0.99
                                                                                                                              13
                                                                                                                                                           407
     Barbuda
                                            Caribbean
Expand rows 5 - 168
                          VNM
                                            East Asia & Pacific
                                                                        Lower middle income
                                                                                                 0.98
                                                                                                                              12.9
                                                                                                                                                           519
169 Vietnam
                                            Middle East & North
    West Bank and Gaza
                          PSE
                                                                        Lower middle income
                                                                                                 0.98
                                                                                                                              12.2
                                                                                                                                                           412
                                            Africa
                                            Middle East & North
                                                                                                 0.95
                          YEM
                                                                         Low income
                                                                                                                              8.1
                                                                                                                                                           321
171
    Yemen, Rep.
                                            Africa
172 Zambia
                          ZMB
                                            Sub-Saharan Africa
                                                                        Lower middle income
                                                                                                                                                           358
                                                                                                 0.94
                                                                                                                              8.8
173 Zimbabwe
                          ZWE
                                            Sub-Saharan Africa
                                                                         Lower middle income
                                                                                                                              11.1
                                                                                                 0.95
                                                                                                                                                           396
174 rows × 13 columns
```

```
def linreg(table,x,y):
    res=linregress(table.dropna()[x], table.dropna()[y])
    print('Correlation:', res.rvalue), print('P-Value:', res.pvalue)
```

```
plt.xlabel(x)
plt.ylabel(y)
plt.plot(table[x], res.intercept + res.slope*table[x], 'r', label='fitted line')

HCI_data.plot(kind='scatter', x='Harmonized Test Scores', y='Adult Survival Rate', figsize=(10, 6), color='darkblue')

plt.title('Correlation between Adult Survival Rate and Harmonized Test Scores')
plt.xlabel('Harmonized Test Scores')
plt.ylabel('Adult Survival Rate')

linreg(HCI_data, 'Harmonized Test Scores', 'Adult Survival Rate')

plt.show()

Correlation: 0.6153470804816563
P-Value: 1.648997379615839e-19
```

Correlation between Adult Survival Rate and Harmonized Test Scores

0.9

0.7

0.6

0.7

0.6

0.7

0.6

Harmonized Test Scores

```
edu_spending = wb.data.DataFrame('NY.ADJ.AEDU.GN.ZS')
percent_gni_spending=edu_spending['YR2010']
{\it \#HCI\_data.merge('region', 'NY.ADJ.AEDU.GN.ZS')}
country_code=HCI_data['WB Code'].fillna(0)
percent_gni_spending = percent_gni_spending[:(len(country_code))]
HCI_data.insert(3, 'GNI Spending on Education', list(percent_gni_spending))
HCI_data
     Country Name object WB Code object
                                                                          GNI Spending on Ed. floa.
                                                                                                       Income Group object
                                                                                                                                Probability of Surv... flo...
                                             Region object
                                                                                                                                                             Exp
     Afghanistan ...... 0.6% AFG ...
                                      ... 0.6%
                                             Europe & Central A...... 27.6%
                                                                          0.53888079544 - 23.62883
                                                                                                       High income ...
                                                                                                                       ..... 32.8%
                                                                                                                                0.88 - 1.0
     Albania ...... 0.6% ALB ...
                                      ... 0.6%
                                             Sub-Saharan Africa ...... 24.1%
                                                                                                       Upper middle in... 27%
     172 others ........ 98.9% 172 others .98.9%
                                             5 others ...
                                                             .....48.3%
                                                                                                       2 others.
                                                                                                                        ... 40.2%
     Afghanistan
                           AFG
                                                                                                                                0.94
                                                                                                                                                             8.9
1
     Albania
                           ALB
                                             Europe & Central Asia
                                                                          4.51243103403928
                                                                                                       Upper middle income
                                                                                                                                0.99
                                                                                                                                                             12.
                                             Middle East & North
2
                           DZA
                                                                          2.84483636363068
                                                                                                       Lower middle income
                                                                                                                                0.98
     Algeria
                                                                                                                                                             11.
                                             Africa
                                             Sub-Saharan Africa
                                                                          1.87551846409296
                                                                                                       Lower middle income
3
     Angola
                           AG0
                                                                                                                                0.92
                                                                                                                                                             8.1
     Antigua and
                                             Latin America &
                           ATG
                                                                          3.57
                                                                                                       High income
                                                                                                                                0.99
                                                                                                                                                             13
                                             Caribbean
     Barbuda
Expand rows 5 - 168
169
                                             East Asia & Pacific
                                                                          4.99016196968434
                                                                                                       Lower middle income
                                                                                                                                0.98
                                                                                                                                                             12.
    Vietnam
                                             Middle East & North
     West Bank and Gaza
                           PSE
                                                                          4.85493423281321
                                                                                                       Lower middle income
                                                                                                                                0.98
                                                                                                                                                             12.
                                             Africa
                                             Middle East & North
171
    Yemen, Rep.
                                                                          8.34
                                                                                                       Low income
                                                                                                                                0.95
                                                                                                                                                             8.1
                                             Africa
```

	Albania 0.6%	AFG 0.6% ALB 0.6%	Region object Europe & Central A 27.6% Sub-Saharan Africa 24.1% 5 others	GNI Spending on Ed floa 0.53888079544 - 23.62883	Income Group object High income 32.8% Upper middle in 27% 2 others 40.2%	Probability of Surv flo	Exp (4.2
172	Zambia	ZMB	Sub-Saharan Africa	0.53888079544	Lower middle income	0.94	8.8
173	Zimbabwe	ZWE	Sub-Saharan Africa	3.4	Lower middle income	0.95	11.
174	rows × 14 columns						

	name object Aruba 0.4% Africa Eastern and 9.4% 264 others 99.2%	False 81.6%	longitude float64 -175.216 - 179.089567	latitude float64 -41.2865 - 64.1836			lendingType object LNX	HIC LMC
ABW	Aruba	False	-70.0167	12.5167	LCN		LNX	HIC
AFE	Africa Eastern and Southern	True	nan	nan				
AFG	Afghanistan	False	69.1761	34.5228	SAS	SAS	IDX	LIC
AFW	Africa Western and Central	True	nan	nan				
AG0	Angola	False	13.242	-8.81155	SSF	SSA	IBD	LMC
Expa	nd rows 5 - 260							
ХКХ	Kosovo	False	20.926	42.565	ECS	ECA	IDX	UMC
YEM	Yemen, Rep.	False	44.2075	15.352	MEA	MNA	IDX	LIC
ZAF	South Africa	False	28.1871	-25.746	SSF	SSA	IBD	UMC
ZMB	Zambia	False	28.2937	-15.3982	SSF	SSA	IDX	LMC
ZWE	Zimbabwe	False	31.0672	-17.8312	SSF	SSA	IDB	LMC

Visualization of HCI_data

```
HCI_data.plot(kind='scatter', x='Harmonized Test Scores', y='GNI Spending on Education', figsize=(10, 6), color='darkblue')

plt.title('Test Scores vs GNI Spending on Education')

plt.xlabel('Learning-Adjusted Years of School')

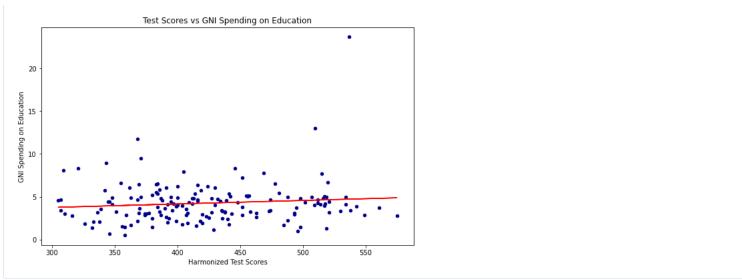
plt.ylabel('GNI Spending on Education')

linreg(HCI_data, 'Harmonized Test Scores', 'GNI Spending on Education')

plt.show()

Correlation: 0.10395515637604857

P-Value: 0.18802067905666314
```



```
HCI_data.plot(kind='scatter', x='Learning-Adjusted Years of School', y='GNI Spending on Education', figsize=(10, 6), color='darkblue')

plt.title('Does GNI Spending Proportion Affect How Many Years Children Spend in School?')

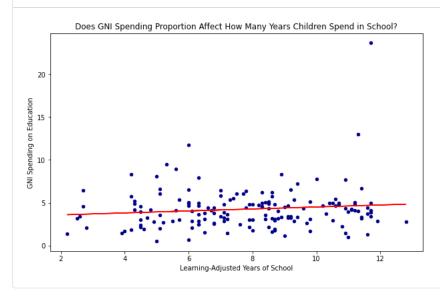
plt.xlabel('Learning-Adjusted Years of School')

plt.ylabel('GNI Spending on Education')

linreg(HCI_data, 'Learning-Adjusted Years of School', 'GNI Spending on Education')

plt.show()
```

Correlation: 0.1152402710161861 P-Value: 0.1442129164997901



http://nces.ed.gov/programs/coe/indicator/cmd#3

```
edu_test = pd.read_excel('edu_spending.xlsx')
edu\_test
     gdp edu 2 - API_SE.XP... o...
                                   Unnamed: 1 object
                                                                                    Unnamed: 3 object
                                                                                                             Unnamed: 4 object
                                                      Unnamed: 2 object
     Country Name .....
                        Government expendi... ..... 99.6%
                                                                                   SE.XPD.PRIM.PC... ... 99.6%
                                                                                                             SE.XPD.PRIM.PC.... .. 20.7%
     Aruba.
                            .. 0.4%
                                   ABW.
                                                .0.4%
                                                      Indicator Name ....... 0.4%
                                                                                   Indicator Code ......... 0.4%
                                                                                                             10.67458 _
     264 others ...
                          ... 99.2%
                                  264 others .... 99.2%
                                                                                                             196 others ..
                                                                                                                              . 78.2%
     Country Name
                                   Country Code
                                                      Indicator Name
                                                                                    Indicator Code
                                                                                                             Last
                                                      Government expenditure
                                                                                                             17.08119
1
     Aruba
                                   ABW
                                                      per student, primary (%
                                                                                    SE.XPD.PRIM.PC.ZS
                                                      of GDP per capita)
```

Aruba 0.4%	Country Code 0.4% ABW 0.4%	·		Unnamed: 4 object SE.XPD.PRIM.PC20.7% 10.674581.1% 196 others78.2%
Afghanistan	AFG	Government expenditure per student, primary (% of GDP per capita)	SE.XPD.PRIM.PC.ZS	10.25174
Africa Western and Central	AFW	Government expenditure per student, primary (% of GDP per capita)	SE.XPD.PRIM.PC.ZS	10.67458
Angola	AGO	Government expenditure per student, primary (% of GDP per capita)	SE.XPD.PRIM.PC.ZS	SE.XPD.PRIM.PC.ZS
nd rows 5 - 260				
Kosovo	XKX	Government expenditure per student, primary (% of GDP per capita)	SE.XPD.PRIM.PC.ZS	SE.XPD.PRIM.PC.ZS
Yemen, Rep.	YEM	Government expenditure per student, primary (% of GDP per capita)	SE.XPD.PRIM.PC.ZS	18.05957
South Africa	ZAF	Government expenditure per student, primary (% of GDP per capita)	SE.XPD.PRIM.PC.ZS	17.94111
Zambia	ZMB	Government expenditure per student, primary (% of GDP per capita)	SE.XPD.PRIM.PC.ZS	12.88822
Zimbabwe	ZWE	Government expenditure per student, primary (% of GDP per capita)	SE.XPD.PRIM.PC.ZS	14.00009
	Country Name	Country Name 0.4% ARW Country Code . 0.4% ABW 0.	Country Name	Country Name 6.4% Country Code 6.4% Aruba 6.4% Aruba 6.4% ABW 6.4% Aruba 6.4% ABW 6.4% Aruba 6.4% ABW 6.4% Aruba 6.4% ABW 6.4% ABW 6.4% Indicator Name 6.4% Indicator Code 6.4% Aruba 6.4% Indicator Code 6.4% Indicator Code 6.4% Aruba 6.4% Indicator Code 6.4% Indic

Coun	edu 2 - API_SE.XP 0 try Name	Country Code . 0.4%	Unnamed: 2 object Government expendi 99.6%			
	others		Indicator Name 0.4%	indicator code0.4%	10.67458 1.1% 196 others 78.2%	
Cour	ntry Name	Country Code	Indicator Name	Indicator Code	Last	
			Government expenditure			
Arul	pa	ABW	per student, primary (% of GDP per capita)	SE.XPD.PRIM.PC.ZS	17.08119	
			Government expenditure			
Afgl	nanistan	AFG	per student, primary (% of GDP per capita)	SE.XPD.PRIM.PC.ZS	10.25174	
Δfr	ica Western and		Government expenditure			
Cent		AFW	per student, primary (% of GDP per capita)	SE.XPD.PRIM.PC.ZS	10.67458	
			Government expenditure			
Ango	ola	AGO	per student, primary (% of GDP per capita)	SE.XPD.PRIM.PC.ZS	SE.XPD.PRIM.PC.ZS	
pand ro	ws 5 - 260					
			Government expenditure			
51 Koso	0V0	XKX	per student, primary (% of GDP per capita)	SE.XPD.PRIM.PC.ZS	SE.XPD.PRIM.PC.ZS	
			Government expenditure			
2 Yeme	en, Rep.	YEM	per student, primary (% of GDP per capita)	SE.XPD.PRIM.PC.ZS	18.05957	

Datathon project

	gdp edu 2 - API_SE.XP 0 Country Name 0.4% Aruba 0.4% 264 others 99.2%	Country Code .0.4% ABW 0.4%	Unnamed: 2 object Government expendi99.6% Indicator Name0.4%	SE.XPD.PRIM.PC 99.6%	
263	South Africa	ZAF	Government expenditure per student, primary (% of GDP per capita)	SE.XPD.PRIM.PC.ZS	17.94111
264	Zambia	ZMB	Government expenditure per student, primary (% of GDP per capita)	SE.XPD.PRIM.PC.ZS	12.88822
265	Zimbabwe	ZWE	Government expenditure per student, primary (% of GDP per capita)	SE.XPD.PRIM.PC.ZS	14.00009
266	rows × 5 columns				

#meı	rged_table_v2=merge	d_table.insert(θ	, "Spending per student(U	S Dollars)", new_lst, True	2)	
	Country Name object Afghanistan 0.7% Albania 0.7% 148 others 98.7%	AFG 0.7% ALB 0.7%	Region object Sub-Saharan Africa 26% Europe & Central A 24.7% 5 others	GNI Spending on Ed floa 0.53888079544 - 23.62883	Income Group object High income	Probability of Surv flo
)	Afghanistan	AFG	South Asia	6.58	Low income	0.94
I	Albania	ALB	Europe & Central Asia	4.51243103403928	Upper middle income	0.99
2	Algeria	DZA	Middle East & North Africa	2.84483636363068	Lower middle income	0.98
ı	Antigua and Barbuda	ATG	Latin America & Caribbean	3.57	High income	0.99
5	Argentina	ARG	Latin America & Caribbean	3.11299593313267	Upper middle income	0.99
хра	nd rows 5 - 144					
168	Vanuatu	VUT	East Asia & Pacific	4.11	Lower middle income	0.97
69	Vietnam	VNM	East Asia & Pacific	4.99016196968434	Lower middle income	0.98
71	Yemen, Rep.	YEM	Middle East & North Africa	8.34	Low income	0.95
72	Zambia	ZMB	Sub-Saharan Africa	0.53888079544	Lower middle income	0.94
73	Zimbabwe	ZWE	Sub-Saharan Africa	3.4	Lower middle income	0.95



```
Visualization of merged_table

Income Group
```

```
merged_table.plot(kind='scatter', x='Harmonized Test Scores', y='Spending per Student (thousands USD)', figsize=(10, 6), color='darkblue')

plt.title('Real Amount Spent on Each Student vs Test Scores')

plt.xlabel('Harmonized Test Scores')

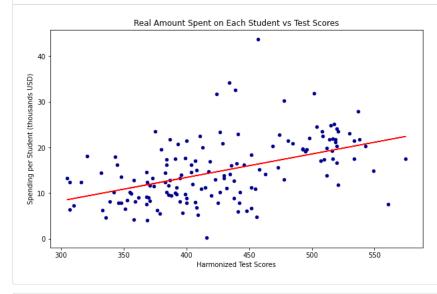
plt.ylabel('Spending per Student (thousands USD)')

linreg(merged_table, 'Harmonized Test Scores', 'Spending per Student (thousands USD)')

plt.show()

Correlation: 0.4765811784750939

P-Value: 3.0192584012384235e-09
```



```
merged_table.plot(kind='scatter', x='Learning-Adjusted Years of School', y='Spending per Student (thousands USD)', figsize=(10, 6), color='datable.plot(kind='scatter', x='Learning-Adjusted Years in School')
plt.xlabel('Learning-Adjusted Years of School')
plt.ylabel('Spending per Student (thousands USD)')

linreg(merged_table, 'Learning-Adjusted Years of School', 'Spending per Student (thousands USD)')
plt.show()

Correlation: 0.4878141235904284
P-Value: 1.1230901902525408e-09
```

