

# [Edx] Mini\_Porject

August 12, 2019

## 1 Let's compare KOREA to JAPAN with Economy Indices.

```
[71]: %matplotlib inline
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import re
plt.style.use('ggplot')
```

### 1.1 Add data with newest dataset ( WDI 2019 )

now\_data is given data by edX

new\_data is newest data from worldbank

However, Format of the dataset's table is differnt.

so It was difficult to join two table simply.

Let's check how differnt two tables.

```
[72]: path = '../Week-5-Visualization/world-development-indicators/Indicators.csv'
now_data = pd.read_csv(path)
```

```
[73]: p = './WDI_csv/WDIData.csv'
new_data = pd.read_csv(p)
```

```
[74]: now_data.head()
```

```
[74]: CountryName CountryCode IndicatorName \
0 Arab World ARB Adolescent fertility rate (births per 1,000 wo...
1 Arab World ARB Age dependency ratio (% of working-age populat...
2 Arab World ARB Age dependency ratio, old (% of working-age po...
3 Arab World ARB Age dependency ratio, young (% of working-age ...
4 Arab World ARB Arms exports (SIPRI trend indicator values)
```

```
IndicatorCode Year Value
0 SP.ADO.TFRT 1960 1.335609e+02
1 SP.POP.DPND 1960 8.779760e+01
2 SP.POP.DPND.OL 1960 6.634579e+00
3 SP.POP.DPND.YG 1960 8.102333e+01
4 MS.MIL.XPRT.KD 1960 3.000000e+06
```

As you can see now\_data looks like above.  
Otherwise, new\_data does not have Year field, but it has many fields by each years like below.

```
[75]: new_data.head()
```

```
[75]: Country Name Country Code \
0 Arab World ARB
1 Arab World ARB
2 Arab World ARB
3 Arab World ARB
4 Arab World ARB

Indicator Name Indicator Code 1960 \
0 2005 PPP conversion factor, GDP (LCU per inter... PA.NUS.PPP.05 NaN
1 2005 PPP conversion factor, private consumptio... PA.NUS.PRVT.PP.05 NaN
2 Access to clean fuels and technologies for coo... EG.CFT.ACCS.ZS NaN
3 Access to electricity (% of population) EG.ELC.ACCS.ZS NaN
4 Access to electricity, rural (% of rural popul... EG.ELC.ACCS.RU.ZS NaN

1961 1962 1963 1964 1965 ... 2010 2011 2012 \
0 NaN NaN NaN NaN NaN ... NaN NaN NaN
1 NaN NaN NaN NaN NaN ... NaN NaN NaN
2 NaN NaN NaN NaN NaN ... 82.368101 82.783289 83.120303
3 NaN NaN NaN NaN NaN ... 86.007620 86.428272 87.070576
4 NaN NaN NaN NaN NaN ... 73.466653 73.942103 75.244104

2013 2014 2015 2016 2017 2018 Unnamed: 63
0 NaN NaN NaN NaN NaN NaN NaN
1 NaN NaN NaN NaN NaN NaN NaN
2 83.533457 83.897596 84.171599 84.510171 NaN NaN NaN
3 88.176836 87.342739 89.130121 89.678685 90.273687 NaN NaN NaN
4 77.162305 75.538976 78.741152 79.665635 80.749293 NaN NaN NaN

[5 rows x 64 columns]
```

This is how i add new datas.

```
[76]: def add_data(now_data,new_data):
    dict_list =[]
    for i in picked_indicators_code :
        nowdata = now_data[now_data['IndicatorCode'] == i]
        add_year = nowdata['Year'].max() + 1
        last = len(now_data)
        while add_year < 2019 :
            filter1 = new_data['Indicator Code'] == i
            filter2 = new_data['Country Name'].isin(now_data['CountryName'])
            target = new_data[filter1 & filter2]
            theyear = int(add_year)
            try:
                added_data ={
```

```

        'CountryName' : target['Country Name'].values[0],
        'CountryCode': target['Country Code'].values[0],
        'IndicatorName':target['Indicator Name'].values[0],
        'IndicatorCode': target['Indicator Code'].values[0],
        'Year':theyear,
        'Value':target[str(add_year)].values[0]
    }
except:
    added_data ={
        'CountryName' : None,
        'CountryCode': None,
        'IndicatorName':None,
        'IndicatorCode': None,
        'Year':None,
        'Value':None
    }
    dict_list.append(added_data)
    add_year = add_year + 1
now_data = now_data.append(dict_list,ignore_index=True)
return now_data

```

## 1.2 Picking the correct indicators to explore

Need to explorer only a particular area of interest ...

The database is so rich with so many indicators that it is desirable to have a better way of picking required indicators.

So I have created a new Indicator list using which specific topics like for eg: Health, Food, Energy etc. can be searched for. Then within each topic required indicators can be more easily picked.

Change IndicatorNames Create a new list of IndicatorName and IndicatorCode such that special characters like “(”, “)”, “,” are replaced just by spaces This new list (modified\_indicators) can be used to search for specific topics as done below

```

[77]: # Create list of unique indicators, indicator codes
Indicator_array = df[['IndicatorName', 'IndicatorCode']].drop_duplicates().
    ↪values
Indicator_array

```

```

[77]: array([[ 'Adolescent fertility rate (births per 1,000 women ages 15-19)',
        'SP.ADO.TFRT'],
        [ 'Age dependency ratio (% of working-age population)',
        'SP.POP.DPND'],
        [ 'Age dependency ratio, old (% of working-age population)',
        'SP.POP.DPND.OL'],
        ...,
        [ 'Fish species, threatened', 'EN.FSH.THRD.NO'],
        [ 'Mammal species, threatened', 'EN.MAM.THRD.NO'],
        [ 'Plant species (higher), threatened', 'EN.HPT.THRD.NO']],
        dtype=object)

```

```
[78]: modified_indicators = []
unique_indicator_codes = []
for ele in Indicator_array:
    indicator = ele[0]
    indicator_code = ele[1].strip()
    if indicator_code not in unique_indicator_codes:
        # delete , ( ) from the IndicatorNames
        new_indicator = re.sub('[,()]', '', indicator).lower()
        # replace - with "to" and make all words into lower case
        new_indicator = re.sub('-', ' to ', new_indicator).lower()
        modified_indicators.append([new_indicator, indicator_code])
        unique_indicator_codes.append(indicator_code)

Indicators = pd.
    ↳ DataFrame(modified_indicators, columns=['IndicatorName', 'IndicatorCode'])
Indicators = Indicators.drop_duplicates()
Indicators.shape
```

[78]: (1344, 2)

```
[79]: # dict , .
key_word_dict = {}
key_word_dict['Demography'] =
    ↳ ['population', 'birth', 'death', 'fertility', 'mortality', 'expectancy']
key_word_dict['Food'] = ['food', 'grain', 'nutrition', 'calories']
key_word_dict['Trade'] =
    ↳ ['trade', 'import', 'export', 'good', 'shipping', 'shipment']
key_word_dict['Health'] = ['health', 'desease', 'hospital', 'mortality', 'doctor']
key_word_dict['Economy'] =
    ↳ ['GNI', 'income', 'gdp', 'gni', 'deficit', 'budget', 'market', 'stock', 'bond', 'infrastructure',
    ↳ 'saving', 'household', 'debt']
key_word_dict['Energy'] =
    ↳ ['fuel', 'energy', 'power', 'emission', 'electric', 'electricity']
key_word_dict['Education'] = ['education', 'literacy']
key_word_dict['Employment'] =
    ↳ ['employed', 'employment', 'unemployed', 'unemployment', 'female']
key_word_dict['Rural'] = ['rural', 'village']
key_word_dict['Urban'] = ['urban', 'city']
key_word_dict['Tech'] = ['technology', 'research', 'intellectual', 'r&d']
```

### 1.2.1 Pick required fields

Now within specific topics we can choose what ever indicators we are interested in

```
[80]: # ( )
feature = 'Economy'
for indicator_ele in Indicators.values:
    for ele in key_word_dict[feature]:
```

```

word_list = indicator_ele[0].split()
if ele in word_list or ele+'s' in word_list:
    # Uncomment this line to print the indicators explicitly
    print(indicator_ele)
    break

```

```

['international migrant stock % of population' 'SM.POP.TOTL.ZS']
['international migrant stock total' 'SM.POP.TOTL']
['merchandise exports to high to income economies % of total merchandise
exports'
'TX.VAL.MRCH.HI.ZS']
['merchandise imports from high to income economies % of total merchandise
imports'
'TM.VAL.MRCH.HI.ZS']
['merchandise trade % of gdp' 'TG.VAL.TOTL.GD.ZS']
['gdp at market prices current us$' 'NY.GDP.MKTP.CD']
['gdp per capita current us$' 'NY.GDP.PCAP.CD']
['gni current us$' 'NY.GNP.MKTP.CD']
['net oda received % of gni' 'DT.ODA.ODAT.GN.ZS']
['co2 emissions kg per 2005 us$ of gdp' 'EN.ATM.CO2E.KD.GD']
['exports of goods and services % of gdp' 'NE.EXP.GNFS.ZS']
['external balance on goods and services % of gdp' 'NE.RSB.GNFS.ZS']
['gdp at market prices constant 2005 us$' 'NY.GDP.MKTP.KD']
['gdp per capita constant 2005 us$' 'NY.GDP.PCAP.KD']
['general government final consumption expenditure % of gdp'
'NE.CON.GOVT.ZS']
['gni constant 2005 us$' 'NY.GNP.MKTP.KD']
['gni per capita constant 2005 us$' 'NY.GNP.PCAP.KD']
['gross domestic income constant 2005 us$' 'NY.GDY.TOTL.KD']
['gross fixed capital formation % of gdp' 'NE.GDI.FTOT.ZS']
['imports of goods and services % of gdp' 'NE.IMP.GNFS.ZS']
['trade % of gdp' 'NE.TRD.GNFS.ZS']
['agriculture value added % of gdp' 'NV.AGR.TOTL.ZS']
['gross capital formation % of gdp' 'NE.GDI.TOTL.ZS']
['gross domestic savings % of gdp' 'NY.GDS.TOTL.ZS']
['gross domestic savings current us$' 'NY.GDS.TOTL.CD']
['household final consumption expenditure current us$' 'NE.CON.PRVT.CD']
['household final consumption expenditure etc. % of gdp' 'NE.CON.PETC.ZS']
['household final consumption expenditure etc. current us$'
'NE.CON.PETC.CD']
['industry value added % of gdp' 'NV.IND.TOTL.ZS']
['manufacturing value added % of gdp' 'NV.IND.MANF.ZS']
['services etc. value added % of gdp' 'NV.SRV.TETC.ZS']
['household final consumption expenditure constant 2005 us$'
'NE.CON.PRVT.KD']
['household final consumption expenditure per capita constant 2005 us$'
'NE.CON.PRVT.PC.KD']

```

['household final consumption expenditure etc. constant 2005 us\$'  
 'NE.CON.PETC.KD']  
 ['gross fixed capital formation private sector % of gdp' 'NE.GDI.FPRV.ZS']  
 ['final consumption expenditure etc. % of gdp' 'NE.CON.TETC.ZS']  
 ['gdp current lcu' 'NY.GDP.MKTP.CN']  
 ['gdp per capita current lcu' 'NY.GDP.PCAP.CN']  
 ['gni current lcu' 'NY.GNP.MKTP.CN']  
 ['gni per capita current lcu' 'NY.GNP.PCAP.CN']  
 ['gross domestic savings current lcu' 'NY.GDS.TOTL.CN']  
 ['gross national expenditure % of gdp' 'NE.DAB.TOTL.ZS']  
 ['household final consumption expenditure current lcu' 'NE.CON.PRVT.CN']  
 ['net income from abroad current lcu' 'NY.GSR.NFCY.CN']  
 ['net income from abroad current us\$' 'NY.GSR.NFCY.CD']  
 ['discrepancy in expenditure estimate of gdp constant lcu'  
 'NY.GDP.DISC.KN']  
 ['discrepancy in expenditure estimate of gdp current lcu' 'NY.GDP.DISC.CN']  
 ['gdp constant lcu' 'NY.GDP.MKTP.KN']  
 ['gdp deflator base year varies by country' 'NY.GDP.DEFL.ZS']  
 ['gdp per capita constant lcu' 'NY.GDP.PCAP.KN']  
 ['gni constant lcu' 'NY.GNP.MKTP.KN']  
 ['gni per capita constant lcu' 'NY.GNP.PCAP.KN']  
 ['gross domestic income constant lcu' 'NY.GDY.TOTL.KN']  
 ['gross domestic savings constant lcu' 'NY.GDS.TOTL.KN']  
 ['household final consumption expenditure constant lcu' 'NE.CON.PRVT.KN']  
 ['household final consumption expenditure etc. constant lcu'  
 'NE.CON.PETC.KN']  
 ['household final consumption expenditure etc. current lcu'  
 'NE.CON.PETC.CN']  
 ['adjusted savings: gross savings % of gni' 'NY.ADJ.ICTR.GN.ZS']  
 ['gross savings % of gdp' 'NY.GNS.ICTR.ZS']  
 ['gross savings % of gni' 'NY.GNS.ICTR.GN.ZS']  
 ['gross savings current lcu' 'NY.GNS.ICTR.CN']  
 ['gross savings current us\$' 'NY.GNS.ICTR.CD']  
 ['net secondary income bop current us\$' 'BN.TRF.CURR.CD']  
 ['net income from abroad constant lcu' 'NY.GSR.NFCY.KN']  
 ['gdp growth annual %' 'NY.GDP.MKTP.KD.ZG']  
 ['gdp per capita growth annual %' 'NY.GDP.PCAP.KD.ZG']  
 ['gni growth annual %' 'NY.GNP.MKTP.KD.ZG']  
 ['gni per capita growth annual %' 'NY.GNP.PCAP.KD.ZG']  
 ['inflation gdp deflator annual %' 'NY.GDP.DEFL.KD.ZG']  
 ['household final consumption expenditure annual % growth'  
 'NE.CON.PRVT.KD.ZG']  
 ['household final consumption expenditure per capita growth annual %'  
 'NE.CON.PRVT.PC.KD.ZG']  
 ['household final consumption expenditure etc. annual % growth'  
 'NE.CON.PETC.KD.ZG']  
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 ['gni atlas method current us\$' 'NY.GNP.ATLS.CD']

['water productivity total constant 2005 us\$ gdp per cubic meter of total  
 freshwater withdrawal'  
 'ER.GDP.FWTL.M3.KD']  
 ['adjusted savings: carbon dioxide damage % of gni' 'NY.ADJ.DCO2.GN.ZS']  
 ['adjusted savings: consumption of fixed capital % of gni'  
 'NY.ADJ.DKAP.GN.ZS']  
 ['adjusted savings: education expenditure % of gni' 'NY.ADJ.AEDU.GN.ZS']  
 ['adjusted savings: energy depletion % of gni' 'NY.ADJ.DNGY.GN.ZS']  
 ['adjusted savings: mineral depletion % of gni' 'NY.ADJ.DMIN.GN.ZS']  
 ['adjusted savings: natural resources depletion % of gni'  
 'NY.ADJ.DRES.GN.ZS']  
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 ['forest rents % of gdp' 'NY.GDP.FRST.RT.ZS']  
 ['mineral rents % of gdp' 'NY.GDP.MINR.RT.ZS']  
 ['natural gas rents % of gdp' 'NY.GDP.NGAS.RT.ZS']  
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 'DT.TDS.DPNG.CD']  
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 ['ppg bonds dis current us\$' 'DT.DIS.PBND.CD']  
 ['ppg bonds dod current us\$' 'DT.DOD.PBND.CD']  
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 ['ppg bonds nfl current us\$' 'DT.NFL.PBND.CD']  
 ['ppg bonds ntr current us\$' 'DT.NTR.PBND.CD']  
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 'DT.AMT.DLTF.CD']

['principal repayments on external debt private nonguaranteed png amt current us\$'  
 'DT.AMT.DPNG.CD']  
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 'DT.AMT.DPPG.CD']  
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 ['short to term debt % of total reserves' 'DT.DOD.DSTC.IR.ZS']  
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 'DT.UND.OFFT.CD']  
 ['undisbursed external debt private creditors und current us\$'  
 'DT.UND.PRVT.CD']  
 ['undisbursed external debt total und current us\$' 'DT.UND.DPPG.CD']  
 ['adjusted net savings excluding particulate emission damage % of gni'  
 'NY.ADJ.SVNX.GN.ZS']  
 ['adjusted savings: net national savings % of gni' 'NY.ADJ.NNAT.GN.ZS']  
 ['personal remittances received % of gdp' 'BX.TRF.PWKR.DT.GD.ZS']  
 ['government expenditure on education as % of gdp %' 'SE.XPD.TOTL.GD.ZS']  
 ['adjusted net savings excluding particulate emission damage current us\$'  
 'NY.ADJ.SVNX.CD']  
 ['adjusted savings: net national savings current us\$' 'NY.ADJ.NNAT.CD']  
 ['debt service ppg and imf only % of exports of goods services and primary income'  
 'DT.TDS.DPPF.XP.ZS']  
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 'DT.INT.DECT.EX.ZS']  
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 'SE.XPD.PRIM.PC.ZS']  
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 'CM.MKT.LCAP.GD.ZS']  
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 ['stocks traded total value current us\$' 'CM.MKT.TRAD.CD']  
 ['foreign direct investment net outflows % of gdp' 'BM.KLT.DINV.GD.ZS']  
 ['stocks traded turnover ratio of domestic shares %' 'CM.MKT.TRNR']  
 ['gdp per person employed constant 1990 ppp \$' 'SL.GDP.PCAP.EM.KD']

['income share held by fourth 20%' 'SI.DST.04TH.20']  
 ['income share held by highest 10%' 'SI.DST.10TH.10']  
 ['income share held by highest 20%' 'SI.DST.05TH.20']  
 ['income share held by lowest 10%' 'SI.DST.FRST.10']  
 ['income share held by lowest 20%' 'SI.DST.FRST.20']  
 ['income share held by second 20%' 'SI.DST.02ND.20']  
 ['income share held by third 20%' 'SI.DST.03RD.20']  
 ['government expenditure per tertiary student as % of gdp per capita %'  
 'SE.XPD.TERT.PC.ZS']  
 ['military expenditure % of gdp' 'MS.MIL.XPND.GD.ZS']  
 ['debt buyback current us\$' 'DT.DSB.DPPG.CD']  
 ['debt forgiveness or reduction current us\$' 'DT.DFR.DPPG.CD']  
 ['debt stock reduction current us\$' 'DT.DSF.DPPG.CD']  
 ['debt stock rescheduled current us\$' 'DT.DXR.DPPG.CD']  
 ['residual debt stock to flow reconciliation current us\$' 'DT.DOD.RSDL.CD']  
 ['total amount of debt rescheduled current us\$' 'DT.TXR.DPPG.CD']  
 ['total change in external debt stocks current us\$' 'DT.DOD.DECT.CD.CG']  
 ['adjusted net savings including particulate emission damage % of gni'  
 'NY.ADJ.SVNG.GN.ZS']  
 ['adjusted savings: particulate emission damage % of gni'  
 'NY.ADJ.DPEM.GN.ZS']  
 ['co2 emissions kg per 2011 ppp \$ of gdp' 'EN.ATM.CO2E.PP.GD.KD']  
 ['co2 emissions kg per ppp \$ of gdp' 'EN.ATM.CO2E.PP.GD']  
 ['energy intensity level of primary energy mj/\$2011 ppp gdp'  
 'EG.EGY.PRIM.PP.KD']  
 ['energy use kg of oil equivalent per \$1000 gdp constant 2011 ppp'  
 'EG.USE.COMM.GD.PP.KD']  
 ['gdp per capita ppp constant 2011 international \$' 'NY.GDP.PCAP.PP.KD']  
 ['gdp per capita ppp current international \$' 'NY.GDP.PCAP.PP.CD']  
 ['gdp per unit of energy use constant 2011 ppp \$ per kg of oil equivalent'  
 'EG.GDP.PUSE.KO.PP.KD']  
 ['gdp per unit of energy use ppp \$ per kg of oil equivalent'  
 'EG.GDP.PUSE.KO.PP']  
 ['gdp ppp constant 2011 international \$' 'NY.GDP.MKTP.PP.KD']  
 ['gdp ppp current international \$' 'NY.GDP.MKTP.PP.CD']  
 ['gni per capita ppp current international \$' 'NY.GNP.PCAP.PP.CD']  
 ['gni ppp current international \$' 'NY.GNP.MKTP.PP.CD']  
 ['household final consumption expenditure ppp current international \$'  
 'NE.CON.PRVT.PP.CD']  
 ['household final consumption expenditure ppp constant 2011 international \$'  
 'NE.CON.PRVT.PP.KD']  
 ['gni per capita ppp constant 2011 international \$' 'NY.GNP.PCAP.PP.KD']  
 ['gni ppp constant 2011 international \$' 'NY.GNP.MKTP.PP.KD']  
 ['cash surplus/deficit % of gdp' 'GC.BAL.CASH.GD.ZS']  
 ['expense % of gdp' 'GC.XPN.TOTL.GD.ZS']  
 ['revenue excluding grants % of gdp' 'GC.REV.XGRT.GD.ZS']  
 ['tax revenue % of gdp' 'GC.TAX.TOTL.GD.ZS']  
 ['taxes on income profits and capital gains % of revenue'

'GC.TAX.YPKG.RV.ZS']  
 ['central government debt total % of gdp' 'GC.DOD.TOTL.GD.ZS']  
 ['net incurrence of liabilities domestic % of gdp' 'GC.FIN.DOMS.GD.ZS']  
 ['net incurrence of liabilities foreign % of gdp' 'GC.FIN.FRGN.GD.ZS']  
 ['adjusted net savings including particulate emission damage current us\$'  
 'NY.ADJ.SVNG.CD']  
 ['ppp conversion factor gdp lcu per international \$' 'PA.NUS.PPP']  
 ['price level ratio of ppp conversion factor gdp to market exchange rate'  
 'PA.NUS.PPPC.RF']  
 ['central government debt total current lcu' 'GC.DOD.TOTL.CN']  
 ['taxes on income profits and capital gains % of total taxes'  
 'GC.TAX.YPKG.ZS']  
 ['taxes on income profits and capital gains current lcu' 'GC.TAX.YPKG.CN']  
 ['female headed households % of households with a female head'  
 'SP.HOU.FEMA.ZS']  
 ['depth of the food deficit kilocalories per person per day' 'SN.ITK.DFCT']  
 ['consumption of iodized salt % of households' 'SN.ITK.SALT.ZS']  
 ['health expenditure private % of gdp' 'SH.XPD.PRIV.ZS']  
 ['health expenditure public % of gdp' 'SH.XPD.PUBL.ZS']  
 ['health expenditure total % of gdp' 'SH.XPD.TOTL.ZS']  
 ['research and development expenditure % of gdp' 'GB.XPD.RSDV.GD.ZS']  
 ['broad money % of gdp' 'FM.LBL.BMNY.GD.ZS']  
 ['claims on central government etc. % gdp' 'FS.AST.CGOV.GD.ZS']  
 ['claims on other sectors of the domestic economy % of gdp'  
 'FS.AST.DOMO.GD.ZS']  
 ['domestic credit provided by financial sector % of gdp'  
 'FS.AST.DOMS.GD.ZS']  
 ['domestic credit to private sector % of gdp' 'FS.AST.PRVT.GD.ZS']  
 ['domestic credit to private sector by banks % of gdp' 'FD.AST.PRVT.GD.ZS']  
 ['liquid liabilities m3 as % of gdp' 'FS.LBL.LIQU.GD.ZS']  
 ['money and quasi money m2 as % of gdp' 'FM.LBL.MQMY.GD.ZS']  
 ['quasi to liquid liabilities % of gdp' 'FS.LBL.QLIQ.GD.ZS']  
 ['currency composition of ppg debt euro %' 'DT.CUR.EURO.ZS']  
 ['cost of business start to up procedures % of gni per capita'  
 'IC.REG.COST.PC.ZS']  
 ['survey mean consumption or income per capita bottom 40% of population 2011 ppp  
 \$ per day'  
 'SI.SPR.PC40']  
 ['survey mean consumption or income per capita total population 2011 ppp \$ per  
 day'  
 'SI.SPR.PCAP']  
 ['adequacy of social insurance programs % of total welfare of beneficiary  
 households'  
 'per\_si\_allsi.adq\_pop\_tot']  
 ['adequacy of social protection and labor programs % of total welfare of  
 beneficiary households'  
 'per\_allsp.adq\_pop\_tot']  
 ['adequacy of unemployment benefits and almp % of total welfare of beneficiary

households'

'per\_lm\_alllm.adq\_pop\_tot']

['benefits incidence in poorest quintile % to all labor market'

'per\_lm\_alllm.ben\_q1\_tot']

['coverage % to all labor market' 'per\_lm\_alllm.cov\_pop\_tot']

['adequacy of social safety net programs % of total welfare of beneficiary households'

'per\_sa\_allsa.adq\_pop\_tot']

['cpia debt policy rating 1=low to 6=high' 'IQ.CPA.DEBT.XQ']

['exports of goods services and primary income bop current us\$'

'BX.GSR.TOTL.CD']

['imports of goods services and primary income bop current us\$'

'BM.GSR.TOTL.CD']

['net oda received % of imports of goods services and primary income'

'DT.ODA.ODAT.MP.ZS']

['primary income payments bop current us\$' 'BM.GSR.FCTY.CD']

['primary income receipts bop current us\$' 'BX.GSR.FCTY.CD']

['secondary income other sectors payments bop current us\$'

'BM.TRF.PRVT.CD']

['trade in services % of gdp' 'BG.GSR.NFSV.GD.ZS']

['secondary income receipts bop current us\$' 'BX.TRF.CURR.CD']

['public and publicly guaranteed debt service % of exports of goods services and primary income'

'DT.TDS.DPPG.XP.ZS']

['short to term debt % of exports of goods services and primary income'

'DT.DOD.DSTC.XP.ZS']

['2005 ppp conversion factor gdp lcu per international \$' 'PA.NUS.PPP.05']

['current account balance % of gdp' 'BN.CAB.XOKA.GD.ZS']

['net primary income bop current us\$' 'BN.GSR.FCTY.CD']

['survey mean consumption or income per capita bottom 40% of population 2005 ppp \$ per day'

'SI.SPR.PC40.05']

['survey mean consumption or income per capita total population 2005 ppp \$ per day'

'SI.SPR.PCAP.05']

['logistics performance index: quality of trade and transport to related infrastructure 1=low to 5=high'

'LP.LPI.INFR.XQ']

['quality of port infrastructure wef 1=extremely underdeveloped to 7=well developed and efficient by international standards'

'IQ.WEF.PORT.XQ']

['annualized average growth rate in per capita real survey mean consumption or income bottom 40% of population %'

'SI.SPR.PC40.ZG']

['annualized average growth rate in per capita real survey mean consumption or income total population %'

'SI.SPR.PCAP.ZG']

['present value of external debt current us\$' 'DT.DOD.PVLX.CD']

```
['present value of external debt % of gni' 'DT.DOD.PVLX.GN.ZS']
['present value of external debt % of exports of goods services and primary
income'
 'DT.DOD.PVLX.EX.ZS']
```

### 1.2.2 Important Features

```
[82]: picked_indicators = [
    #economy
    ['gdp per capita current us$' 'NY.GDP.PCAP.CD'],
    ['gdp growth annual %' 'NY.GDP.MKTP.KD.ZG'],
    ['gni per capita ppp current international $' 'NY.GNP.PCAP.PP.CD'],
    ['foreign direct investment net inflows % of gdp' 'BX.KLT.DINV.WD.GD.ZS'],

    # tech
    ['high to technology exports % of manufactured exports' 'TX.VAL.TECH.MF.
    →ZS'],
    ['high to technology exports current us$' 'TX.VAL.TECH.CD'],
    ['researchers in r&d per million people' 'SP.POP.SCIE.RD.P6'],
    ['technicians in r&d per million people' 'SP.POP.TECH.RD.P6'],

    # employment
    ['unemployment total % of total labor force' 'SL.UEM.TOTL.ZS'],
    ['unemployment total % of total labor force national estimate' 'SL.UEM.TOTL.
    →NE.ZS'],
    ['employers total % of employment' 'SL.EMP.MPYR.ZS'],

    # Social
    ['labor force participation rate female % of female population ages 15+
    →national estimate' 'SL.TLF.CACT.FE.NE.ZS'],
    ['age dependency ratio old % of working to age population' 'SP.POP.DPND.
    →OL'],
    ['birth rate crude per 1000 people' 'SP.DYN.CBRT.IN'],

    # Government
    ['central government debt total % of gdp' 'GC.DOD.TOTL.GD.ZS'],
    ['gross savings current us$' 'NY.GNS.ICTR.CD'],

    ]
```

### 1.2.3 Seperate only Indicator Code from above list.

```
[83]: picked_indicators_code = []
    for ele in picked_indicators :
        code = re.findall('([A-Z.]\S*)',ele[0])
```

```
picked_indicators_code.append(code[0])
```

```
picked_indicators_code
```

```
[83]: ['NY.GDP.PCAP.CD',
      'NY.GDP.MKTP.KD.ZG',
      'NY.GNP.PCAP.PP.CD',
      'BX.KLT.DINV.WD.GD.ZS',
      'TX.VAL.TECH.MF.ZS',
      'TX.VAL.TECH.CD',
      'SP.POP.SCIE.RD.P6',
      'SP.POP.TECH.RD.P6',
      'SL.UEM.TOTL.ZS',
      'SL.UEM.TOTL.NE.ZS',
      'SL.EMP.MPYR.ZS',
      'SL.TLF.CACT.FE.NE.ZS',
      'SP.POP.DPND.OL',
      'SP.DYN.CBRT.IN',
      'GC.DOD.TOTL.GD.ZS',
      'NY.GNS.ICTR.CD']
```

#### 1.2.4 Subset of data with the required features alone

#### 1.2.5 Chose only India and China for Analysis

```
[84]: # Subset of data with the required features alone
df_subset = df[df['IndicatorCode'].isin(picked_indicators_code)]

# Chose only India and China for Analysis
df_korea = df_subset[df['CountryName'].str.contains("Korea, Rep")]
df_japan = df_subset[df['CountryName'].str.contains("Japan")]
```

```
/usr/local/lib/python3.7/site-packages/ipykernel_launcher.py:5: UserWarning:
Boolean Series key will be reindexed to match DataFrame index.
```

```
"""
/usr/local/lib/python3.7/site-packages/ipykernel_launcher.py:6: UserWarning:
Boolean Series key will be reindexed to match DataFrame index.
```

```
[85]: df_korea = add_data(df_korea,new_data)
      df_japan = add_data(df_japan,new_data)
```

```
[86]: def plot_indicator(indicator, delta=10):
      # df
      ds_korea =
      →df_korea[['IndicatorName','Year','Value']][df_korea['IndicatorCode']==indicator]
      ds_japan =
      →df_japan[['IndicatorName','Year','Value']][df_japan['IndicatorCode']==indicator]
```

```

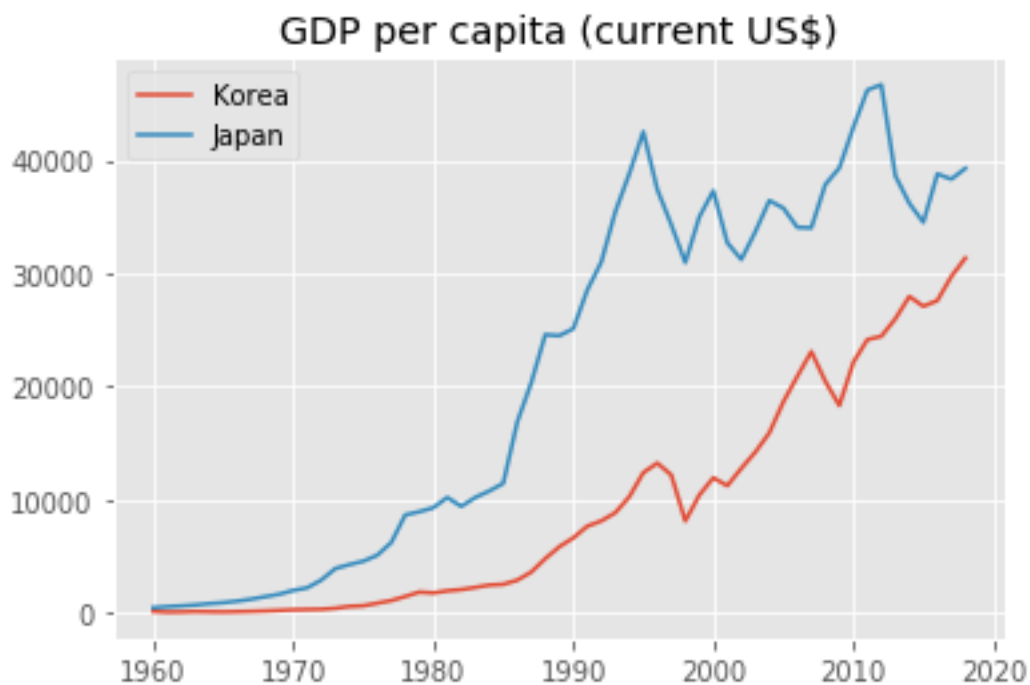
try:
    title = ds_korea['IndicatorName'].iloc[0]
except:
    title = "None"

ykorea = ds_korea['Value'].values
yjapan = ds_japan['Value'].values
xkorea = ds_korea['Year'].values
xjapan = ds_japan['Year'].values

plt.plot(xkorea,ykorea,label='Korea')
plt.plot(xjapan,yjapan,label='Japan')
plt.title(title)
plt.legend(loc=2)

```

```
[87]: plot_indicator(picked_indicators_code[0])
```



```
[ ]:
```