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#### Part I

### $\mathbf{Q}\mathbf{1}$

I noted my insights for both languages below:

#### Python

- I have not enough experience but according to what I heard commonly, Python is more capable in modelling & machine learning
- I think syntax of Python is easier to read and write comparing the R. R has disadvantage especially due to paranthesis
- As far as I know, Python is preferred more among data analists/scientists

#### $\mathbf{R}$

- Better for charming visualisation
- Better reporting capabilities and customization opportunities with Markdown comparing Jupyter notebook
- R Studio looks more friendly for new starters comparing PyCharm
- My insights are that R have variety of libraries, on the other hand coming with consistency problems of the libraries

Opinions stated in the dataschool website commonly overlap with my thoughts but at the end of the day, both languages have advantages and disadavntages. So I think that a data scientist should have capabilities to an extend in both languages and should prefer the one better satisfing the need.

#### $\mathbf{Q2}$

First, the objective - question to be identified - should be clarified. Then I determine what I need to answer the question and continue with understanding what I have on hand. I design the execution of analysis considering the outputs from understanding the data on hand and execute accordingly to reach a conclusion answering the initial objective.

Following the example in the question; I can measure the impact of each project through finding the correlations of overall welfare with each project. Delta of overall welfare per unit of improvement project. Most probably marginal benefit to overall welfare will decrease and considering the marginal benefit curve can be used to allocate funds efficiently. If I found a clear picture showing which projects should be focused for each welfare levels, info becomes valuable for me.

I prefer to present what the data says but I must explain the results of the analysis in a meaningful way.

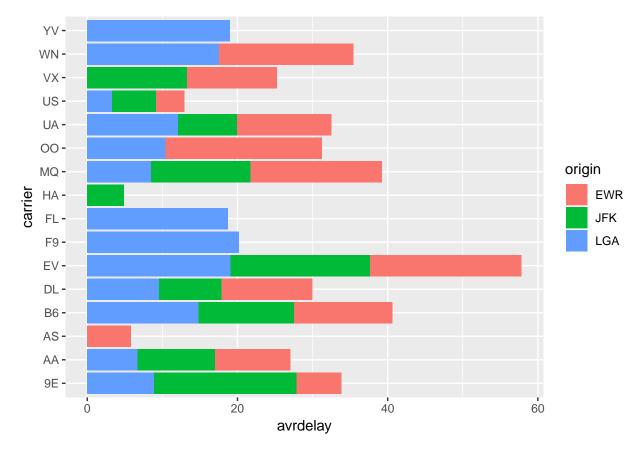
#### $\mathbf{Q3}$

I prefer to draw average delay time according to carriers and origins of flight. I choose delay time instead of arrival time because intuitively we know that departure delays are more than arrival delays. Carriers and the airports are key variables to analyze delay times, that is why I choose these variables. This plot can be used as starting point for following detailed analysis.

```
library(dplyr)
library(nycflights13)
library(ggplot2)
```

```
f1 <- flights %>%
    select(dep_delay, carrier, origin) %>%
    group_by(carrier,origin) %>%
    summarize(avrdelay=mean(dep_delay, na.rm=TRUE))

ggplot (data=fl, aes(x=carrier, y=avrdelay)) +
    geom_bar(stat='identity', aes(fill=origin)) +
    coord_flip()
```



## Part II

I choose to extend our group term project analysis through comparing the YoY percentage change of total export and import values with change in value of currencies of each countries. The steps of my analysis are as follows:

Loading the required libraries.

```
library(tidyverse)
library(readxl)
library(reshape2)
```

Reading our group project's cleaned the RDS files.

githubURL\_export <- ("https://github.com/MEF-BDA503/gpj18-group\_four/blob/master/export\_jTable.rds?raw=githubURL\_import <- ("https://github.com/MEF-BDA503/gpj18-group\_four/blob/master/import\_jTable.rds?raw=githubURL\_exportMELTED <- ("https://github.com/MEF-BDA503/gpj18-group\_four/blob/master/export\_jTableMEL

```
githubURL_importMELTED <- ("https://github.com/MEF-BDA503/gpj18-group_four/blob/master/import_jTableMELTED <- ("https://githubURL_export))
import_jTable<- readRDS(url(githubURL_import))
export_jTableMELTED<- readRDS(url(githubURL_exportMELTED))
import_jTableMELTED<- readRDS(url(githubURL_importMELTED))

rm(githubURL_export)
rm(githubURL_import)
rm(githubURL_exportMELTED)
rm(githubURL_importMELTED)</pre>
```

I run the report on TCMB Website to gather closing FX rates of each year from 2013 to 2018 and save as Excel file. Then I read this file and manipulated.

```
Fxtable <- read_excel("C:/Users/emrek/Google Drive/BDA/503-EssentialsOfDataAnalytics/GitHub/pj18-EmreKerFxtable <- Fxtable %>% melt(id=c("year"))
colnames(Fxtable) <- c("Year", "Fx", "FxYoYChg")
```

I also manipulated trade stat data of our porject

```
tableExport <- export_jTableMELTED %>%
  group_by(Country, year) %>%
  summarise(totalExpV=sum(Values,na.rm=TRUE)) %>%
  arrange(Country, year) %>%
  mutate(ExpValChng = (totalExpV - lag(totalExpV))/lag(totalExpV)*100)
tableImport <- import_jTableMELTED %>%
  group_by(Country, year) %>%
  summarise(totalImpV=sum(Values,na.rm=TRUE)) %>%
  arrange(Country, year) %>%
  mutate(ImpValChng = (totalImpV - lag(totalImpV))/lag(totalImpV)*100)
Tradetable <- full_join(tableExport,tableImport) %>%
  select(Country, year, Export="ExpValChng", Import = "ImpValChng") %>%
  melt(id=c("Country", "year")) %>%
  filter(year!=2013)
colnames(Tradetable) <- c("Country","Year","TradeType","TradeYoYChg")</pre>
Tradetable <- Tradetable %>% mutate(Fx = ifelse (Country =="Canada", "CAD",
                                       ifelse(Country=="Russian", "RUB",
                                         ifelse(Country=="China", "CNY",
                                         ifelse(Country=="India", "INR",
                                         ifelse(Country=="Japan", "JPY",
                                         ifelse(Country=="UK", "GBP",
                                         ifelse(Country=="USA", "USD", "EUR")))))))
Tradetable <- transform(Tradetable, Year = as.numeric(Year))</pre>
```

And join the trade stat data with FX data.

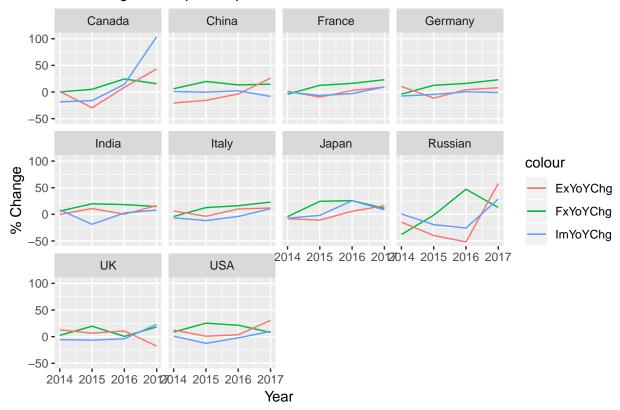
```
df <- left_join(Tradetable,Fxtable)

df <- df %>% select (Country, Fx, Year, FxYoYChg, TradeType, TradeYoYChg) %>%
    dcast(Country+Fx+Year+FxYoYChg~TradeType)
```

```
colnames(df) <- c("Country", "Fx", "Year", "FxYoYChg", "ExYoYChg", "ImYoYChg")</pre>
```

And visualized change in export value, change in import value and change of each countries' FX rate over years according to trade partner countries.

## YoY Changes for Export, Import and FX Rates



Normally, I expect that in times TL depreciated against each countries currencies (hike in green line), export to these countries rises while imports declines.

I see this positive collerated pattern only for India but the other countries do not support this thesis. So, change of FX rate with countries does not enough to explain changes in export and import values.

## Part III

```
library(jsonlite)
url <- ("https://www.timeshighereducation.com/sites/default/files/the_data_rankings/world_university_rankings <- from JSON(url)</pre>
```

```
WUR_2019 <- jsonfile[[1]]
saveRDS(WUR_2019,file="C:/Users/emrek/Google Drive/BDA/503-EssentialsOfDataAnalytics/GitHub/pj18-EmreKer
rm(url)
rm(jsonfile)
rm(data)</pre>
```

I want to found out the universities which has high scores although their countries are not successful considering the average scores of all universities in this country. The data is extracted from timeshighereducation website and shows the 2019 survey.

First, I calculate world average score for each score type and average scores of each country per score type. Then I marked the countries as "Above Average" or "Below Average" considering whether each of their scores is above or below world average (per each score type).

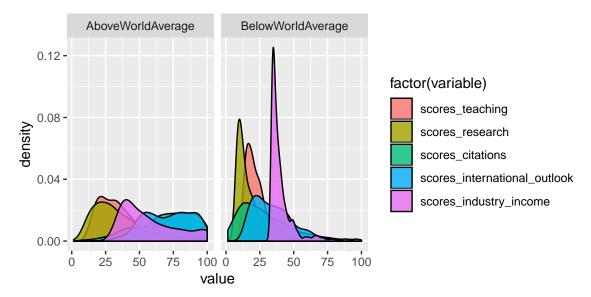
```
wur <- readRDS("C:/Users/emrek/Google Drive/BDA/503-EssentialsOfDataAnalytics/GitHub/pj18-EmreKemerci/F
wur <- wur %>% select (name, location, scores_teaching, scores_research, scores_citations, scores_inter.
    melt(id=c("name", "location"))

wur$value <- as.numeric(wur$value)

wur <- wur %>% group_by(variable) %>% mutate(world_avr_score_per_score_type=mean(value))

wur <- wur %>% group_by(location, variable) %>% mutate(location_avr_score_per_score_type=mean(value))

wur <- wur %>% mutate(CountryGroup = ifelse(location_avr_score_per_score_type > world_avr_score_per_score_
ggplot(wur, aes(value)) +
    geom_density(aes(fill=factor(variable)), alpha=0.8) +
    facet_wrap(-CountryGroup)
```



As seen

above; "above world average" group's scores spreads in a wide range although they are tighten in low scores for "below world average" group. Since I want to find the universities diverging their countries, I focus to find the universities in right tail of "below world average" group density graph.

To do this, I filtered "below world average" countries, then filtered top universities in each score type for each country. And visulazied as follows:

```
wur2 <- wur %>% filter(CountryGroup=="BelowWorldAverage")
wur2 <- wur2 %>% select (name, location, variable, value, location_avr_score_per_score_type)
wur2 <- wur2 %>% group_by(location, variable) %>% top_n(value, n=1)
wur_teaching <- wur2 %>% filter(variable=="scores_teaching")
wur_research <- wur2 %>% filter(variable=="scores_research")
wur_citations <- wur2 %>% filter(variable=="scores_citations")
wur_outlook <- wur2 %>% filter(variable=="scores_international_outlook")
wur_income <- wur2 %>% filter(variable=="scores_industry_income")
ggplot(wur_teaching, aes(x=substr(name, start = 1, stop = 30))) +
  geom_point(aes(y=value, color=value)) +
  theme(axis.text.x = element_text(size=8, angle = 90)) +
  labs(title="Top Universities from the Group of Below Average Countries", subtitle="According to Teach
     Top Universities from the Group of Below Average Countries
     According to Teaching Score
                                                                                                     value
  60
Score 40 -
                                                                                                         60
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                  Iuliu Hatieganu University of
Ivane Javakhishvili Tbilisi St
Khalifa University
King Saud bin Abdulaziz Univer
                                         Riga Technical University
                                    lational University of
                                  National Taiwan
                                              UniversityName
ggplot(wur_research, aes(x=substr(name, start = 1, stop = 30))) +
  geom_point(aes(y=value, color=value)) +
  theme(axis.text.x = element_text(size=8, angle = 90)) +
  labs(title="Top Universities from the Group of Below Average Countries", subtitle="According to Resea
     Top Universities from the Group of Below Average Countries
     According to Research Score
                                                                                                     value
  75
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9 50 ·
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```

Simón Bolívar

UniversityName

Vational Taiwan University

onosov Moscow

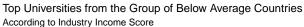
25

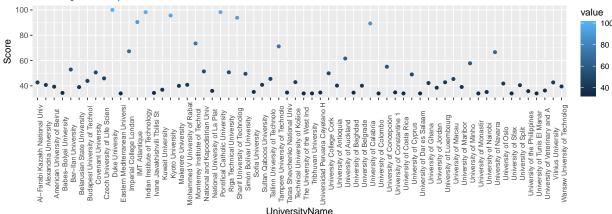
thens University of Economics adji Mokhtar University – Ann

Belarusian State University Charles University in Prague Chulalongkorn University comenius University in Bratisl

ndian Institute of Scier

```
ggplot(wur_citations, aes(x=substr(name, start = 1, stop = 30))) +
     geom_point(aes(y=value, color=value)) +
     theme(axis.text.x = element_text(size=8, angle = 90)) +
     labs(title="Top Universities from the Group of Below Average Countries", subtitle="According to Citat
             Top Universities from the Group of Below Average Countries
             According to Citations Score
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                                            SOMSATS University Islamabad
                                                Eastern Mediterranean Universi
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                                                                                                                                                                         Jniversiti Tunku Abdul Rahman
                                        Comenius University in Bratisl
                                    Charles University in Prague
                                                             Indian Institute of Technology
                                                                                  -viv Polytechnic National Univ
                                                                                                      Polytechnic Institute of Porto
                           Belarusian State University
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                                                                         Jordan University of Science
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                                                                                              National Taiwan University
                                                                                          Aetropolitan Autonomous Un
                                                                                                                           Sepuluh Nopember Institute
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                        Babol Noshirvani University
                                                                                                          Pompeu Fabra University
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                                                                                      Mahidol University
                                                                                                                                                                                 University of Béjaïa
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                                Bilkent University
                                                                             Kuwait University
                                                                                                                                                        Teikyo University
                                                                                                                                        Sofia University
                                                                                                          UniversityName
ggplot(wur_outlook, aes(x=substr(name, start = 1, stop = 30))) +
     geom_point(aes(y=value, color=value)) +
     theme(axis.text.x = element_text(size=8, angle = 90)) +
     labs(title="Top Universities from the Group of Below Average Countries", subtitle="According to Inter-
           Top Universities from the Group of Below Average Countries
           According to International Outlook Score
                                                                                                                                                                                                                                        value
      80
 Score
      60
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                                       Czech University of Life Scien
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                   Amrita Vishwa Vidyapeetham
              American University in Cairo
                                                 Iuliu Hatieganu University of
                                                      Ivane Javakhishvili Tbilisi St
                                                                                         National University of Cuyo
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                                                                                                                       The University of Aizu
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                                                                                                                            Fribhuvan University
                                                                                                                                                          University of Ibadan
                                                                                                                                      University of Béjaïa
                                                                                                                                                                    University of Latvia
                                                                                                                                                                                             University of Split
                                                                                                        RUDN University
                                                                                                             Sofia University
                                                                                                          UniversityName
ggplot(wur_income, aes(x=substr(name, start = 1, stop = 30))) +
     geom_point(aes(y=value, color=value)) +
     theme(axis.text.x = element_text(size=8, angle = 90)) +
     labs(title="Top Universities from the Group of Below Average Countries", subtitle="According to Indus
```





the universities which has high scores although their countries are not successful considering the average scores of all universities in this country are:

- University of Tokyo in "Teaching Score" although Japan is below the world average in teaching score.
- Tsinghua University in "Research Score" although China is below the world average in research score.
- Babol Noshirvani University in "Citation Score" although Iran is below the world average in citation score.
- Massachusetts Inst. of Tech in "International Outlook Score" although USA is below the world average in international outlook score.
- Duke University in "Industry Income Score" although USA is below the world average in international outlook score.