head(data_cwur)

Exploratory Data Analysis of Center for World University Rankings (CWUR)

Code **▼**

```
Hide
getwd()
[1] "G:/"
                                                                                       Hide
setwd("G:/")
data1<-read.csv("cwurData.csv")</pre>
str(data1)
'data.frame':
              2200 obs. of 14 variables:
$ world rank
                    : int 12345678910...
 $ institution
                   : Factor w/ 1024 levels "Ã-rebro University",..: 194 322 520 653 63 442 8
33 1009 106 643 ...
$ country
                   : Factor w/ 59 levels "Argentina", "Australia", ...: 59 59 59 57 59 57 59
59 59 ...
$ national rank : int 1 2 3 1 4 5 2 6 7 8 ...
$ quality_of_education: int 7 9 17 10 2 8 13 14 23 16 ...
 $ alumni employment : int 9 17 11 24 29 14 28 31 21 52 ...
 $ quality of faculty : int 1 3 5 4 7 2 9 12 10 6 ...
 $ publications
                     : int 1 12 4 16 37 53 15 14 13 6 ...
 $ influence
                    : int 1 4 2 16 22 33 13 6 12 5 ...
                     : int 1 4 2 11 22 26 19 15 14 3 ...
 $ citations
 $ broad_impact
                    : int NA NA NA NA NA NA NA NA NA ...
                     : int 5 1 15 50 18 101 26 66 5 16 ...
 $ patents
 $ score
                     : num 100 91.7 89.5 86.2 85.2 ...
 $ year
                     Hide
data cwur<-data1
```

world_	_rank	inst	itution	country	national_r	ank quality	y_of_ed	duc
tion								
1	1	Harvard Uni	versity	USA		1		
7								
2	2 Massachuset	ts Institute of Tec	hnology	USA		2		
9								
3	3	Stanford Uni	versity	USA		3		
17								
4	4	University of Ca	mbridge Unit	ted Kingdom		1		
10		•	_	_				
5	5 Californ	ia Institute of Tec	hnology	USA		4		
2			<u> </u>					
6	6	Princeton Uni	versity	USA		5		
8			,					
alumni	employment qual	<pre>ity_of_faculty publ</pre>	ications in	fluence cita	ations broa	nd impact pa	atents	:
ore year		,						
1	9	1	1	1	1	NA	5	10
0.00 201	.2							
2	17	3	12	4	4	NA	1	9
1.67 201								
3	11	5	4	2	2	NA	15	8
9.50 201	.2							
4	24	4	16	16	11	NA	50	8
6.17 201			-	-		-		
5	- - 29	7	37	22	22	NA	18	8
- 5.21 201		-				•	_0	
6 6	14	2	53	33	26	NA	101	;
2.50 201		-	33	22				•
2.50 201	- -							

#Descriptive Statistics
dim(data_cwur)

[1] 2200 14

Hide

summary(data_cwur)

world_rank	institution	n country national_rank
Min. : 1.0	École normale supérieure - Paris: 4	4 USA :573 Min. : 1.00
1st Qu.: 175.8	$ ilde{A}\%$ cole Polytechnique : 4	4 China :167 1st Qu.: 6.00
Median : 450.5	Arizona State University : 4	4 Japan :159 Median : 21.00
Mean : 459.6	Boston University : 4	4 United Kingdom:144 Mean : 40.28
3rd Qu.: 725.2	Brown University : 4	4 Germany :115 3rd Qu.: 49.00
Max. :1000.0	California Institute of Technology: 4	4 France :109 Max. :229.00
	(Other) :2176	6 (Other) :933
quality_of_educ	ation alumni_employment quality_of_facult	ty publications influence
Min. : 1.0	Min. : 1.0 Min. : 1.0	Min. : 1.0 Min. : 1.0
1st Qu.:175.8	1st Qu.:175.8 1st Qu.:175.8	1st Qu.: 175.8 1st Qu.:175.8
Median :355.0	Median :450.5 Median :210.0	
Mean :275.1	Mean :357.1 Mean :178.9	Mean : 459.9 Mean :459.8
3rd Qu.:367.0	3rd Qu.:478.0 3rd Qu.:218.0	3rd Qu.: 725.0 3rd Qu.:725.2
Max. :367.0	Max. :567.0 Max. :218.0	Max. :1000.0 Max. :991.0
citations	broad_impact patents sco	ore year
Min. : 1.0	Min. : 1.0 Min. : 1.0 Min.	: 43.36 Min. :2012
1st Qu.:161.0	1st Qu.: 250.5 1st Qu.:170.8 1st Qu.	.: 44.46 1st Qu.:2014
Median :406.0		: 45.10 Median :2014
Mean :413.4		: 47.80 Mean :2014
3rd Qu.:645.0		.: 47.55 3rd Qu.:2015
Max. :812.0		:100.00 Max. :2015

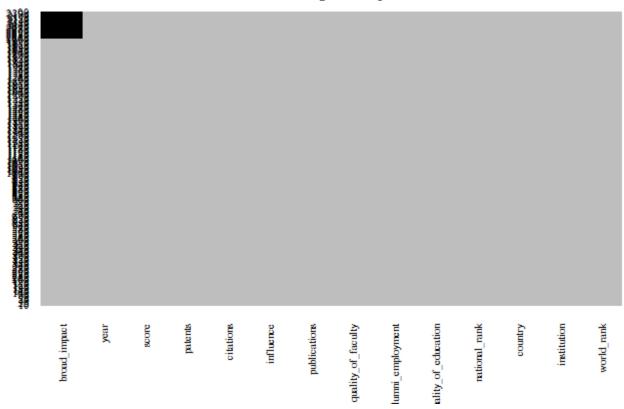
#check for missing values
colSums(is.na(data_cwur))

quality_of_e	national_rank	country	institution	world_rank
				ducation
	0	0	0	0
				0
С	influence	publications	quality_of_faculty	alumni_employment
		•	, ,_ ,_ ,	itations
	0	0	0	0
				0
	year	score	patents	broad_impact
	0	0	0	200

Hide

```
library(Amelia)
missmap(data_cwur, col=c("black", "grey"), legend=FALSE)
```

Missingness Map



We see that only variable broad impact is having missing values. Removing Broad Impact variable because it contains missing values and imputing it is not a good option and also because it has data of ony two years i.e. 2014 and 2015.

```
data_cwur$broad_impact<-NULL
str(data_cwur)
```

```
'data.frame':
              2200 obs. of 13 variables:
$ world rank
                     : int 1 2 3 4 5 6 7 8 9 10 ...
 $ institution
                     : Factor w/ 1024 levels "Ã-rebro University",..: 194 322 520 653 63 442 8
33 1009 106 643 ...
                     : Factor w/ 59 levels "Argentina", "Australia", ...: 59 59 59 57 59 57 59
 $ country
59 59 ...
 $ national rank
                     : int 1231452678...
 $ quality_of_education: int
                           7 9 17 10 2 8 13 14 23 16 ...
 $ alumni employment
                     : int
                           9 17 11 24 29 14 28 31 21 52 ...
 $ quality_of_faculty : int
                           1 3 5 4 7 2 9 12 10 6 ...
 $ publications
                     : int
                           1 12 4 16 37 53 15 14 13 6 ...
 $ influence
                     : int
                           1 4 2 16 22 33 13 6 12 5 ...
 $ citations
                     : int 1 4 2 11 22 26 19 15 14 3 ...
 $ patents
                     : int
                           5 1 15 50 18 101 26 66 5 16 ...
 $ score
                            100 91.7 89.5 86.2 85.2 ...
                     : num
 $ year
                     : int
```

#check class of each variable
sapply(data_cwur,class)

	d_rank	institution	country	national_rank qu	ality_of_e
	teger"	"factor"	"factor"	"integer"	
"integer" alumni_empl	oyment qua	ality_of_faculty	publications	influence	С
	teger"	"integer"	"integer"	"integer"	
"integer"	atents	score	year		
"ir	teger"	"numeric"	"integer"		

Hide

#check levels of factor variables
nlevels(data_cwur\$institution)

[1] 1024

Hide

nlevels(data_cwur\$country)

[1] 59

Hide

#checking distribution of countries
sort(table(data_cwur\$country),decreasing=TRUE)

	USA	China	Japan	United Kingdom	
Germany					
	573	167	159	144	
115					
	France	Italy	Spain	Canada	Sou
th Korea					
	109	96	81	72	
72					
	Australia	Taiwan	Brazil	India	Net
herlands					
	58	46	36	31	
29					
	Switzerland	Austria	Sweden	Israel	
Belgium					
	26	24	24	22	
20					
	Finland	Turkey	Poland	Iran	
Ireland					
	20	20	18	16	
16					
	Greece	Portugal	Denmark	Hong Kong	
Hungary					
	14	14	12	12	
12					
	New Zealand	Norway	Czech Republic	South Africa	
Russia					
	12	12	10	10	
9					
	Chile	Egypt	Saudi Arabia	Argentina	
Malaysia	_	_	_	_	
_	8	8	8	7	
6					
	Thailand	Singapore	Colombia	Mexico	
Slovenia	_	_		_	
_	6	5	4	4	
4					
	Romania	Bulgaria	Croatia	Cyprus	
Estonia	_	_	_		
	3	2	2	2	
2					
.	Iceland	Lebanon	Lithuania	Puerto Rico	
Serbia	_	_	-	_	
_	2	2	2	2	
2			Hotel Aug 5 5 1		
210	vak Republic		United Arab Emirates	Uruguay	
	2	2	2	2	

#Convert year variable into factor variable
data_cwur\$year<-as.factor(data_cwur\$year)</pre>

cbind(frequency=table(data_cwur\$country),percentage=prop.table(table(data_cwur\$country)*100))

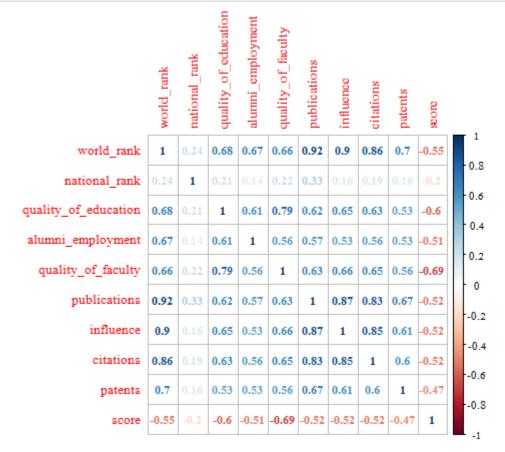
	frequency	percentage
Argentina	7	0.0031818182
Australia	58	0.0263636364
Austria	24	0.0109090909
Belgium	20	0.0090909091
Brazil	36	0.0163636364
Bulgaria	2	0.0009090909
Canada	72	0.0327272727
Chile	8	0.0036363636
China	167	0.0759090909
Colombia	4	0.0018181818
Croatia	2	0.0009090909
Cyprus	2	0.0009090909
Czech Republic		0.0045454545
Denmark	_	0.0054545455
Egypt		0.0036363636
Estonia	2	0.0009090909
Finland	- 20	0.0090909091
France		0.0495454545
Germany	-	0.0522727273
Greece	_	0.0063636364
Hong Kong		0.0054545455
Hungary		0.0054545455
Iceland		0.00094949499
India	31	0.0140909091
Iran		0.0072727273
Ireland	-	0.0072727273
Israel		0.0100000000
Italy		0.0436363636
Japan		0.0722727273
Lebanon		0.0009090909
Lithuania	_	0.0009090909
Malaysia		0.0003030303
Mexico	•	0.0027272727
Netherlands		0.0131818182
New Zealand		0.0054545455
Norway		0.0054545455
Poland		0.0034343433
Portugal	_	0.0063636364
Puerto Rico		0.0003030304
Romania		0.0013636364
Russia		0.0040909091
Saudi Arabia		0.0036363636
Serbia	_	0.0009090909
		0.0022727273
Singapore		0.0022727273
Slovak Republic Slovenia		
South Africa		0.0018181818 0.0045454545
South Africa South Korea		0.0327272727
		0.0327272727
Spain Sweden	_	
Sweden Switzerland		0.0109090909
		0.0118181818
Taiwan	46	0.0209090909

Thailand	6	0.0027272727
Turkey	20	0.0090909091
Uganda	2	0.0009090909
United Arab Emirates	2	0.0009090909
United Kingdom	144	0.0654545455
Uruguay	2	0.0009090909
USA	573	0.2604545455

We can see that USA>China>Japan>UK>Germany>France>Italy has highest no. of top class intitutions. India has 31 institutes out of 2200 top institutions that are listed in university rankings.

Hide

```
library(corrplot)
cor<-cor(data_cwur[,c(1,4,5,6,7,8,9,10,11,12)])
corrplot(cor,method="number")</pre>
```



We see that world rank has high correlations with publications, influences and citations. Quality of education has high correlation with quality of faculty

Data Visualization

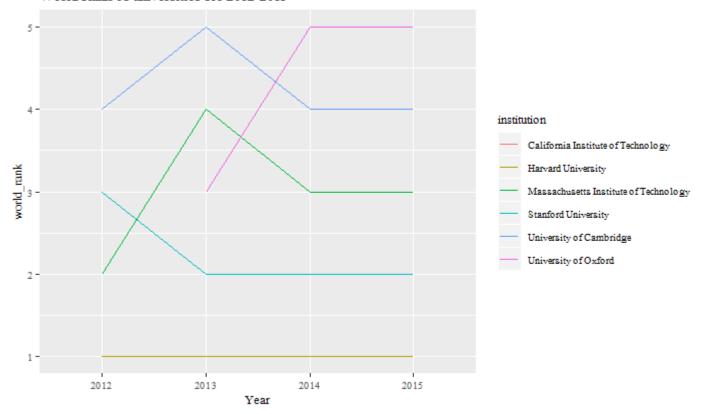
Hide

```
library(ggplot2)
library(dplyr)
# 1. Top 5 universities according to world rank for all the years 2012-2015
data_cwur %>%
  group_by(year) %>%
  select(year,world_rank,institution) %>%
  top_n(-5,world_rank)
```

year <fctr></fctr>	world_rank <int></int>	institution <fctr></fctr>				
2012	1	Harvard University				
2012	2	Massachusetts Institute of Technology				
2012	3	Stanford University				
2012	4	University of Cambridge				
2012	5	California Institute of Technology				
2013	1	Harvard University				
2013	2	Stanford University				
2013	3	University of Oxford				
2013	4	Massachusetts Institute of Technology				
2013	5	University of Cambridge				
1-10 of 20 rows		Previo	us	1	2	Next

```
data_cwur %>%
  group_by(year) %>%
  select(year,world_rank,institution) %>%
  top_n(-5,world_rank) %>%
  ggplot(aes(x=year,y=world_rank,group=institution))+
  geom_line(aes(color=institution))+
  labs(x="Year","World Rank",title="World Rank of universities for 2012-2015")
```

World Rank of universities for 2012-2015



NA

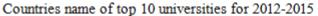
We can say that Harvard University remained at 1st rank for 2012-2015. Stanford was ranked 3rd in 2012 and then ranked 2nd for 2013-2015.

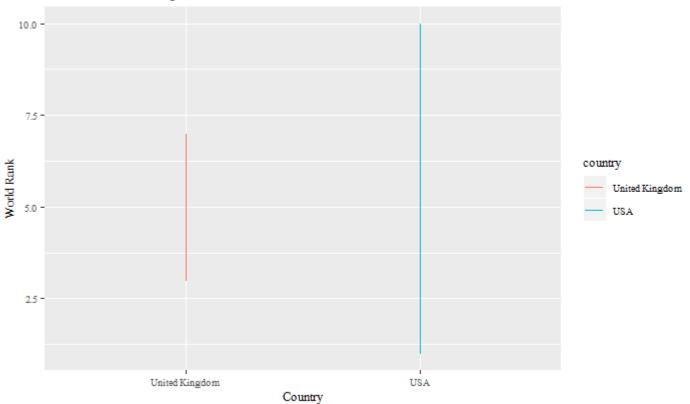
Hide

Hide

```
# 2. Country name of top 10 universities for the years 2012-2015
data_cwur %>%
  group_by(year) %>%
  select(country,world_rank,institution) %>%
  top_n(-10,world_rank) %>%
  ggplot(aes(x=country,y=world_rank,color=country))+
  geom_line()+
  labs(x="Country",y="World Rank",title="Countries name of top 10 universities for 2012-2015")
```

Adding missing grouping variables: `year`





We see that only 2 countries are in top 10 i.e. USA and UK.

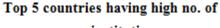
3. Top 5 Countries having high no. of institutions in world ranking
x<-head(sort(table(data_cwur\$country),decreasing=TRUE),n=5)
x</pre>

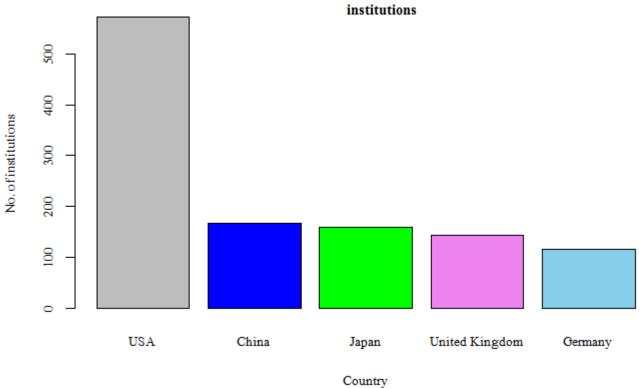
USA	China	Japan Unite	d Kingdom	Germany
573	167	159	144	115

Hide

Hide

barplot(x,xlab="Country",ylab="No. of institutions",main="Top 5 countries having high no. of
 institutions",col=c("grey","blue","green","violet","skyblue"))





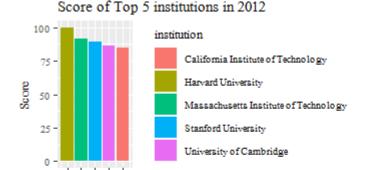
We see that top 5 countries having high no. of institutes in world ranking are: USA, China, Japan, UK, Germany

4. Year wise Top 5 institute's score
data_cwur %>%
 group_by(year) %>%
 select(year,world_rank,institution,score) %>%
 top_n(-5,world_rank)

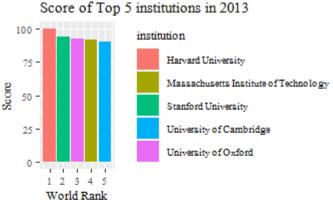
year <fctr></fctr>	world_rank <int></int>	institution <fctr></fctr>	score <dbl></dbl>
2012	1	Harvard University	100.00
2012	2	Massachusetts Institute of Technology	91.67
2012	3	Stanford University	89.50
2012	4	University of Cambridge	86.17
2012	5	California Institute of Technology	85.21
2013	1	Harvard University	100.00
2013	2	Stanford University	93.94
2013	3	University of Oxford	92.54
2013	4	Massachusetts Institute of Technology	91.45

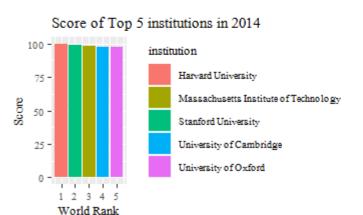
year <fctr></fctr>	world_rank <int></int>	institution <fctr></fctr>			S	core <dbl></dbl>	
2013	5	University of Cambridge				90.24	ŀ
1-10 of 20 rov	WS		Previous	1	2	Nex	t

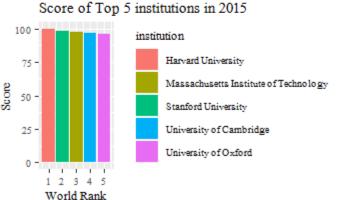
```
fun<-function(yr){
data_cwur %>%
  filter(year==yr) %>%
  select(world_rank,institution,score) %>%
  top_n(-5,world_rank) %>%
  ggplot(aes(x=world_rank,y=score,group=institution))+
  geom_bar(aes(fill=institution),stat="identity")+
  labs(x="World Rank",y="Score",title=paste("Score of Top 5 institutions in",yr))
}
yr_2012<-fun(2012)
yr_2013<-fun(2013)
yr_2014<-fun(2014)
yr_2015<-fun(2015)
library(gridExtra)
grid.arrange(yr_2012,yr_2013,yr_2014,yr_2015, ncol=2)</pre>
```



1 2 3 4 5 World Rank







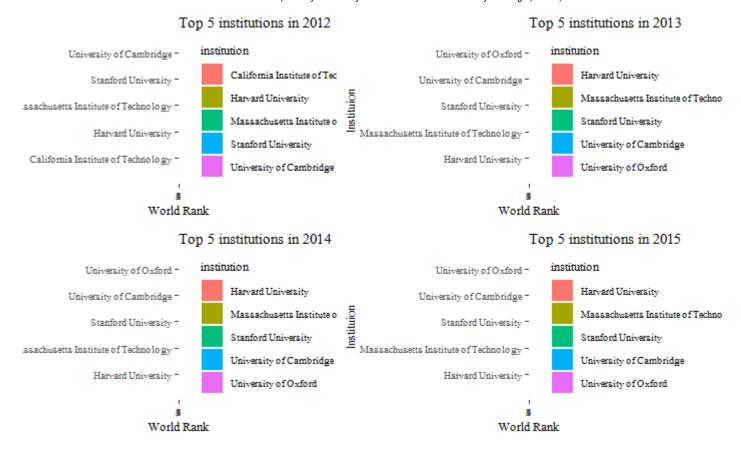
We see that Harvard has highest score of 100 then Stanford for 4 consecutive years 2012-2015

Hide

```
# 5. Year wise Top 5 institutes
data_cwur %>%
  group_by(year) %>%
  select(year, world_rank, institution) %>%
  top_n(-5, world_rank)
```

year <fctr></fctr>	world_rank <int></int>	institution <fctr></fctr>				
2012	1	Harvard University				
2012	2	Massachusetts Institute of Technology				
2012	3	Stanford University				
2012	4	University of Cambridge				
2012	5	California Institute of Technology				
2013	1	Harvard University				
2013	2	Stanford University				
2013	3	University of Oxford				
2013	4	Massachusetts Institute of Technology				
2013	5	University of Cambridge				
1-10 of 20 rows			Previous	1	2	Next

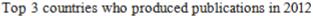
```
fun1<-function(yr){
  data_cwur %>%
    filter(year==yr) %>%
    select(world_rank,institution) %>%
    top_n(-5,world_rank) %>%
    ggplot(aes(x=world_rank,y=institution,fill=institution))+
    geom_bar(stat="identity")+
    labs(x="World Rank",y="Instituion",title=paste("Top 5 institutions in",yr))
}
yr1_2012<-fun1(2012)
yr1_2013<-fun1(2013)
yr1_2014<-fun1(2014)
yr1_2015<-fun1(2015)
library(gridExtra)
grid.arrange(yr1_2012,yr1_2013,yr1_2014,yr1_2015, ncol=2)</pre>
```

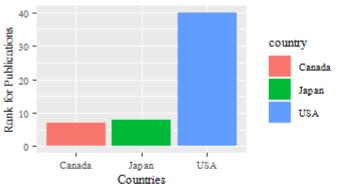


We see that Harvard was ranked 2nd in 2012 and after that it remained at 1st rank for 2013-2015. Also, in 2012, MIT was ranked 2nd but from 2013-2015, Stanford has got 2nd rank.

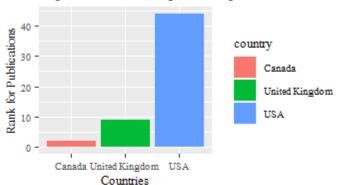
Hide

```
# 6. Top 3 countries having high ranking in publications
pub1<-data cwur %>%
  filter(year==2012) %>%
  top n(-10, publications) %>%
  ggplot(aes(x=country,y=publications,fill=country))+geom bar(stat="identity")+
labs(x="Countries",y="Rank for Publications",title=paste("Top 3 countries who produced publicati
ons in 2012"))
pub2<-data cwur %>%
  filter(year==2013) %>%
  top_n(-10,publications) %>%
  ggplot(aes(x=country,y=publications,fill=country))+geom bar(stat="identity") +
  labs(x="Countries",y="Rank for Publications",title=paste("Top 3 countries who produced publica
tions in 2013"))
pub3<-data cwur %>%
  filter(year==2014) %>%
  top n(-10, publications) %>%
  ggplot(aes(x=country,y=publications,fill=country))+geom bar(stat="identity") +
  labs(x="Countries",y="Rank for Publications",title=paste("Top 3 countries who produced publica
tions in 2014"))
pub4<-data cwur %>%
  filter(year==2015) %>%
  top n(-10, publications) %>%
  ggplot(aes(x=country,y=publications,fill=country))+geom_bar(stat="identity") +
  labs(x="Countries",y="Rank for Publications",title=paste("Top 3 countries who produced publica
tions in 2015"))
grid.arrange(pub1,pub2,pub3,pub4,ncol=2)
```

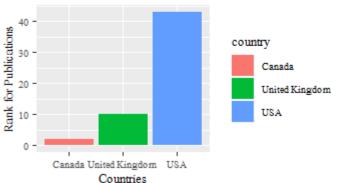




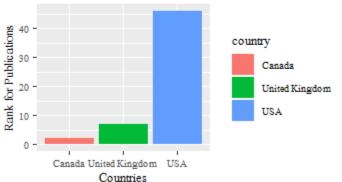
Top 3 countries who produced publications in 2013



Top 3 countries who produced publications in 2014



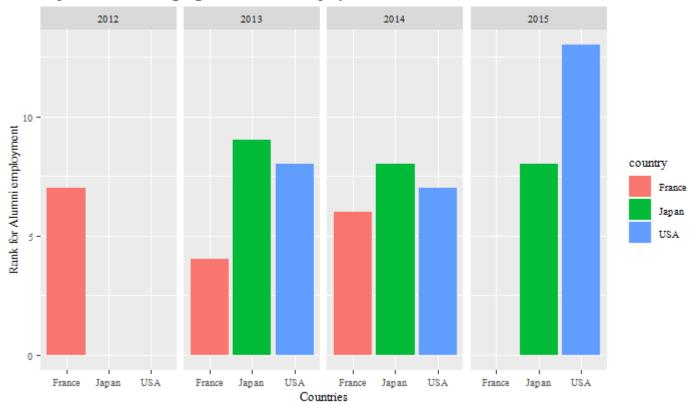
Top 3 countries who produced publications in 2015



Top 3 countries having high ranking in quality of education are: USA>UK>Canada>Japan

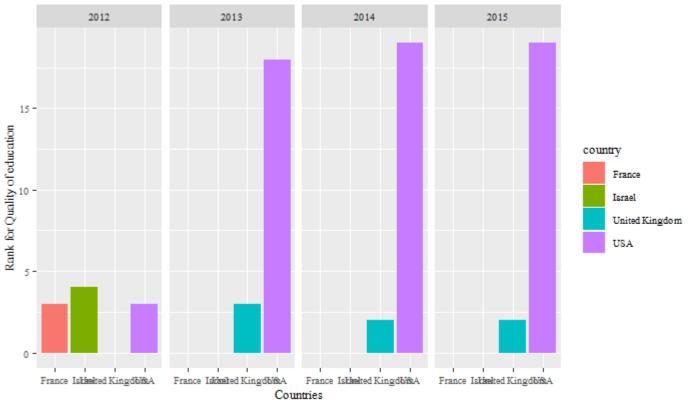
```
# 7. Top 3 countries having high ranking in alumni employment
data_cwur %>%
  top_n(-20,alumni_employment) %>%
  ggplot(aes(x=country,y=alumni_employment,fill=country))+
  geom_bar(stat="identity")+facet_grid(.~year)+
  labs(x="Countries",y="Rank for Alumni employment",
  title="Top 3 countries having high rank in alumni employment")
```

Top 3 countries having high rank in alumni employment



Top 3 countries having high ranking in alumni employment are: USA>Japan>France

Top 3 countries having high rank in quality of education



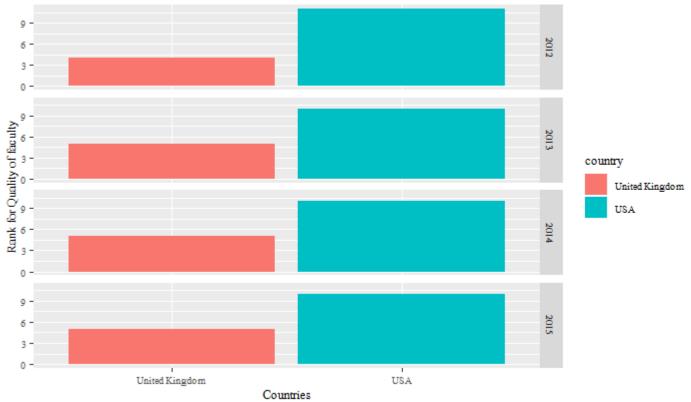
Top 3 countries having high ranking in quality of education are: USA>UK>Israel>France. For 2013 and 2014, Japan has high rank than USA.

```
#9. Top 3 countries having high ranking in quality of faculty

data_cwur %>%
    top_n(-20,quality_of_faculty) %>%
    ggplot(aes(x=country,y=quality_of_faculty,fill=country))+
    geom_bar(stat="identity")+facet_grid(year~.)+

labs(x="Countries",y="Rank for Quality of faculty",
    title="Top 3 countries having high rank in quality of faculty")
```





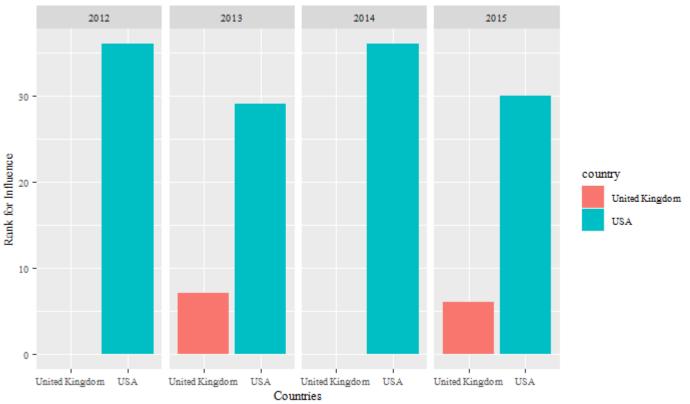
NA .

Hide

Hide

Top 3 countries having high ranking in quality of faculty are: USA>UK.

Top 3 countries having high rank for Influence



Top 3 countries having high ranking for Influence are: USA>UK. In top 20 rankings, only USA is there.

```
# 11. Top 3 countries having high ranking for citations

data_cwur %>%

top_n(-30,citations) %>%

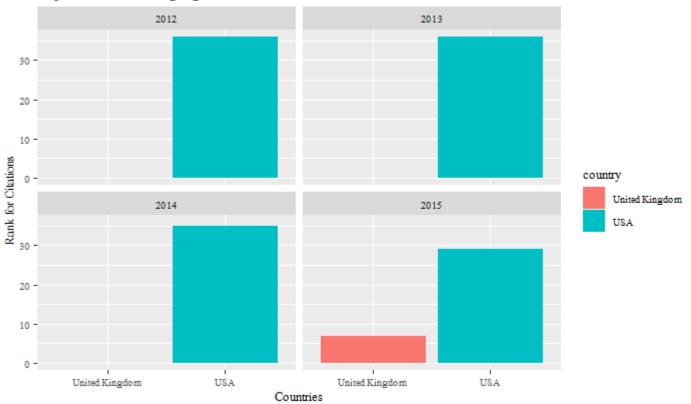
ggplot(aes(x=country,y=citations,fill=country))+

geom_bar(stat="identity")+facet_wrap(~year)+

labs(x="Countries",y="Rank for Citations",

title="Top 3 countries having high rank for Citations")
```

Top 3 countries having high rank for Citations



Top 3 countries having high ranking for Citations are: USA>UK. In top 20 rankings, only USA is there.

```
# 12. Top 3 countries having high ranking for Patents

data_cwur %>%

top_n(-20,patents) %>%

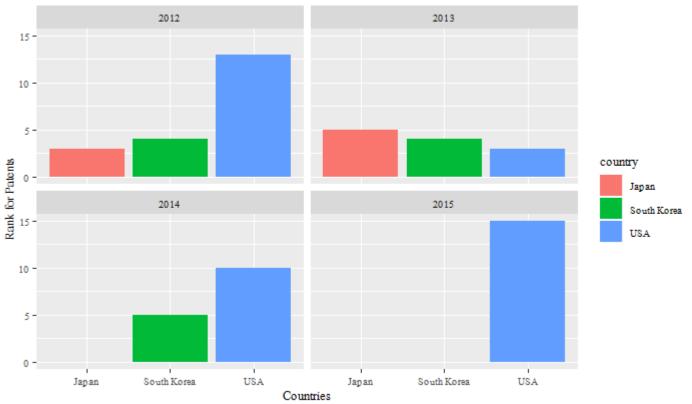
ggplot(aes(x=country,y=patents,fill=country))+

geom_bar(stat="identity")+facet_wrap(~year)+

labs(x="Countries",y="Rank for Patents",

title="Top 3 countries having high rank for Patents")
```

Top 3 countries having high rank for Patents



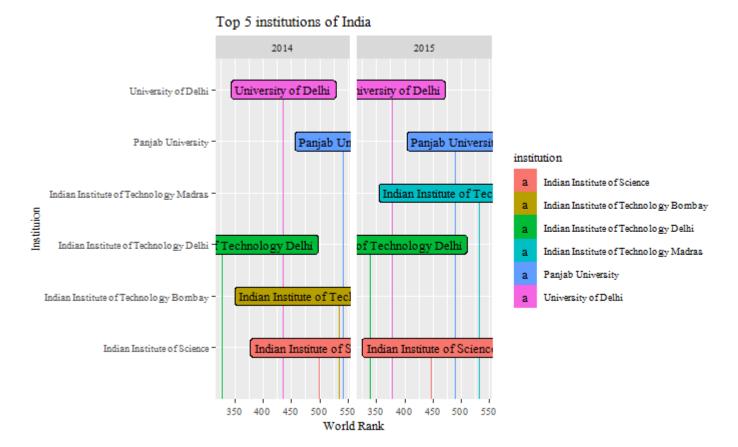
Top 3 countries having high ranking for Patents are: USA>South Korea>Japan.

#Top 3 countries having high ranking for Patents are: USA>South Korea>Japan.
#13. Top 5 Indian universities year wise according to world rank
library(dplyr)
data_cwur %>%
filter(country=="India") %>%
group_by(year)%>%
select(year,world_rank,institution) %>%
top_n(-5,world_rank)

year <fctr></fctr>	world_rank <int></int>	institution <fctr></fctr>
2014	328	Indian Institute of Technology Delhi
2014	436	University of Delhi
2014	501	Indian Institute of Science
2014	535	Indian Institute of Technology Bombay
2014	543	Panjab University
2015	341	Indian Institute of Technology Delhi
2015	379	University of Delhi
2015	448	Indian Institute of Science

year <fctr></fctr>	world_rank <int></int>	institution <fctr></fctr>
2015	491	Panjab University
2015	534	Indian Institute of Technology Madras
1-10 of 10 rows		

```
library(dplyr)
data_cwur %>%
  filter(country=="India") %>%
  group_by(year)%>%
  select(year,world_rank,institution) %>%
  top_n(-5,world_rank)%>%
  ggplot(aes(x=world_rank,y=institution,fill=institution))+
  geom_bar(stat="identity")+
  facet_grid(.~year)+
  labs(x="World Rank",y="Instituion",title=paste("Top 5 institutions of India "))+
  geom_label(aes(label=institution))
```



We see that top 5 countries world rank wise in 2015 were: IIT Delhi, Delhi University, IISC Bangalore, Panjab University and IIT Madras.

Hide

Hide

```
#14. Score of top 5 Indian universities
data_cwur %>%
  filter(country=="India") %>%
  group_by(year)%>%
  select(year,world_rank,institution,score) %>%
  top_n(-5,world_rank)
```

year <fctr></fctr>	world_rank <int></int>	institution <fctr></fctr>	score <dbl></dbl>
2014	328	Indian Institute of Technology Delhi	46.10
2014	436	University of Delhi	45.40
2014	501	Indian Institute of Science	45.11
2014	535	Indian Institute of Technology Bombay	45.00
2014	543	Panjab University	44.97
2015	341	Indian Institute of Technology Delhi	45.54
2015	379	University of Delhi	45.30
2015	448	Indian Institute of Science	44.96
2015	491	Panjab University	44.80
2015	534	Indian Institute of Technology Madras	44.68
1-10 of 10 rd	ows		

We see that score of Indian university is between 45-46.

Hide

```
#15. Compare scores of top 5 World rank institutes and top 5 Indian universities in 2015
a<-data_cwur %>%
  filter(year==2015) %>%
  select(year,world_rank,institution,score) %>%
  top_n(-5,world_rank)
b<-data_cwur %>%
  filter(country=="India",year==2015) %>%
  select(world_rank,institution,score) %>%
  top_n(-5,world_rank)
cbind(a,b)
```

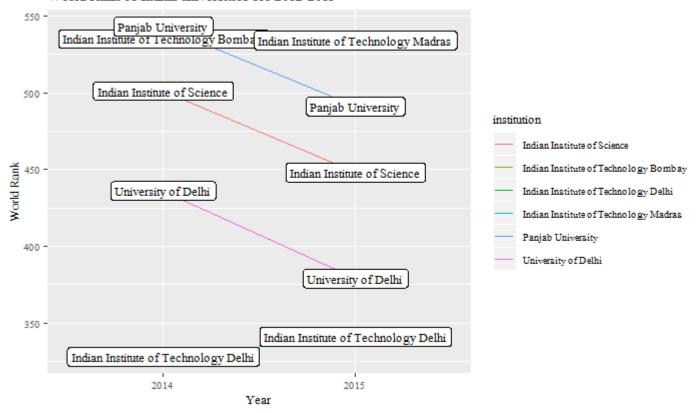
```
institution score world_rank
 year world_rank
1 2015
                                     Harvard University 100.00
                                                                       341
2 2015
                2
                                    Stanford University 98.66
                                                                       379
3 2015
                3 Massachusetts Institute of Technology 97.54
                                                                       448
4 2015
                                University of Cambridge 96.81
                                                                       491
5 2015
                5
                                   University of Oxford 96.46
                                                                       534
                            institution score
  Indian Institute of Technology Delhi 45.54
2
                    University of Delhi 45.30
3
            Indian Institute of Science 44.96
4
                      Panjab University 44.80
5 Indian Institute of Technology Madras 44.68
```

	world_	rank			inst	itution n	ational_r	ank qu	ality_of_education	alumni_emp
10	yment	341	Indian	Institute of	Technology	/ Delhi		1	367	
2	59	379		Un:	iversity of	f Delhi		2	240	
3	72	448		Indian Ins	titute of S	Science		3	367	
4	332	491		ı	Panjab Univ	versity		4	333	
5	167	534	Indian 1	Institute of ¹	Technology	Madras		5	367	
	147 qualit	y_of_	faculty	publications	influence	citation	s patents	score		
1			218	635	943	81	2 625	45.54		
2			218	703	763	81	2 797	45.30		
3			218	315	537	51	1 239	44.96		
4			218	720	786	36	8 824	44.80		
5			218	523	943	81	2 317	44.68		

Hide

```
#compare top 5 Indian universities in world rankings for the year 2014 and 2015
data_cwur %>%
  group_by(year) %>%
  filter(country=="India") %>%
  select(year,world_rank,institution) %>%
  top_n(-5,world_rank) %>%
  ggplot(aes(x=year,y=world_rank,group=institution))+
  geom_line(aes(color=institution))+
  labs(x="Year",y="World Rank",title="World Rank of Indian universities for 2012-2015")+
  geom_label(aes(label=institution))
```

World Rank of Indian universities for 2012-2015



We can see rank of Indian universities has improved from 2014 to 2015 except from IIT Delhi