

index.Rmd

Introduction

The main goal of our reserch is finding variables which affect the student's ability generally through comparison of test scores from differend countries. Especially, we will focus on how inerenet accessibility bring effects on student's ability. Recently, some reserchers found that internet accessibility might bring reverse affect on student's ability because they spend more time on net surfing and gathering information through internet without thinking.

Methodology

To analyze our research theme, we used the Data from Programme for International Student Assessment(PISA) that conducts assesment about the We picked up the result of **Mathmatics, Reading and Problem Solving** that is conductet in 2012. Also, we picked the result of 2003 Problem solving as well, which is a direct assesment of life competencies that apply across different areas of the school curriculum. This data is benefitial to analyze student's ability that is not measured by academic ability.

Picked up coutries are depended on PISA data avairability,

Then, we have analyzed the correlation between these variables.

Data gathering and merging process

The first dataset is from **PISA**, and the second from **the World Bank**. Both datasets are open and can be found in their respective webpages.

Data Source

1. PISA: We downloaded and picked the following three datas up to use as dependent variables:

Variable	Variable Name	Description
DV	math	Mathmatics mean score(2012)
DV	reading	Readind mean score(2012)
DV	ps	Prolem Solving mean score(2012)

2. The World Bank: Taking aveirability into account, we picked the following variables up as explanetory variables from the World Bank Data.

Variable	Variable Name	Description
IV	GDPperc	GDP per Capita (current US\$)
IV	expend	Government expenditure on education, total (% of GDP)
IV	pop	Population, total
IV	popd	Population density (people per sq. km of land area)

Variable	Variable Name	Description
IV	rteacher	Primary school pupil-teacher ratio is the average number of pupils per teacher in primary school
IV	eyear	Number of years that children are legally obliged to attend school
IV	internet	internet users (per 100 people). Internet users are individuals who have used the Internet (from any location) in the last 12 months. Internet can be used via a computer, mobile phone, personal digital assistant, games machine, digital TV etc.
IV	mobile	Mobile cellular subscriptions (per 100 people)

We have cleaned and merged the relevant data of both datasets. Then, we have generate tables and figures to relate the data with the aim of addressing, as well as possible, our researching question to begin to determine whether our hypothesis is correct or not.

Multiple Regression

Table:Regression Estimates of Math Score

Dependent variable:			
	Math Score		
	(1)	(2)	(3)
log(GDPperc)	29.666*** (5.794)	22.703** (9.524)	-7.883 (10.680)
log(pop)	1.642 (3.249)	7.587 (6.643)	11.018** (5.264)
popd	0.004* (0.002)	0.005 (0.003)	0.003 (0.004)
rteacher		-4.035 (2.616)	-0.956 (2.173)
eyear		-8.544 (5.699)	-7.042 (4.473)
expend		11.785 (7.097)	-2.215 (6.412)
internet			2.522*** (0.602)
mobile			0.452 (0.319)
(intercept)	145.762 (87.914)	216.904 (156.559)	240.336 (143.650)
Observations	63	34	34
R2	0.388	0.451	0.690
Adjusted R2	0.357	0.328	0.591
Residual Std. Error	41.891 (df = 59)	45.818 (df = 27)	35.750 (df = 25)
F Statistic	12.455*** (df = 3; 59)	3.689*** (df = 6; 27)	6.963*** (df = 8; 25)

Note:

*p<0.1; **p<0.05; ***p<0.01

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\begin{table}[!htbp] \centering
\caption{Table:Regression Estimates of Math Score}
\label{}
\begin{tabular}{@{\extracolsep{5pt}}lccc}
\hline
\hline
& \multicolumn{3}{c}{\textit{Dependent variable:}} \hline
\cline{2-4}
\hline
& \multicolumn{3}{c}{Math Score} \hline
\hline
& (1) & (2) & (3) \hline
\hline
log(GDPperc) & 29.666$^{***}$ & 22.703$^{**}$ & $-$7.883 \hline
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\end{tabular}
\end{table}
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<table style="text-align:center"><caption><strong>Table:Regression Estimates of Math Score</strong></caption>
<tr><td colspan="4" style="border-bottom: 1px solid black"></td></tr><tr><td style="text-align:left"></td><td colspan="3" style="border-bottom: 1px solid black"></td></tr>
<tr><td style="text-align:left"></td><td colspan="3">Math Score</td></tr>
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</table>

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Why can't I get a table on PDF??

Call:

```
lm(formula = reading ~ log(GDPperc) + log(pop) + popd + rteacher +
    eyear + expend, data = data)
```

Residuals:

	Min	1Q	Median	3Q	Max
	-111.950	-16.008	3.598	22.750	50.636

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	187.641002	129.801722	1.446	0.1598
log(GDPperc)	20.996377	7.896508	2.659	0.0130 *
log(pop)	7.919981	5.507794	1.438	0.1619
popd	0.003439	0.002311	1.488	0.1483
rteacher	-2.787892	2.168506	-1.286	0.2095
eyear	-7.205603	4.724850	-1.525	0.1389
expend	13.659393	5.884454	2.321	0.0281 *

Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 37.99 on 27 degrees of freedom
 (29 observations deleted due to missingness)
 Multiple R-squared: 0.4628, Adjusted R-squared: 0.3435
 F-statistic: 3.877 on 6 and 27 DF, p-value: 0.006411

Call:

```
lm(formula = reading ~ internet + mobile + log(GDPperc) + log(pop) +
    popd + rteacher + eyear + expend, data = data)
```

Residuals:

Min	1Q	Median	3Q	Max
-72.220	-8.297	1.841	18.542	46.734

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	198.843065	123.844972	1.606	0.120925
internet	1.959607	0.519093	3.775	0.000881 ***
mobile	0.383294	0.274898	1.394	0.175492
log(GDPperc)	-2.676702	9.207544	-0.291	0.773673
log(pop)	10.655010	4.537883	2.348	0.027090 *
popd	0.001603	0.003215	0.499	0.622419
rteacher	-0.349618	1.873351	-0.187	0.853459
eyear	-5.995144	3.856552	-1.555	0.132626
expend	2.735772	5.527635	0.495	0.624974

Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 30.82 on 25 degrees of freedom
 (29 observations deleted due to missingness)
 Multiple R-squared: 0.6726, Adjusted R-squared: 0.5678
 F-statistic: 6.419 on 8 and 25 DF, p-value: 0.0001491

Call:

```
lm(formula = ps ~ log(GDPperc) + log(pop) + popd + rteacher +
    eyear + expend, data = data)
```

Residuals:

Min	1Q	Median	3Q	Max
-43.338	-5.947	4.057	8.202	44.884

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	214.289111	101.400223	2.113	0.05064 .
log(GDPperc)	29.944236	7.403851	4.044	0.00094 ***
log(pop)	10.371807	4.617193	2.246	0.03915 *
popd	0.002725	0.001792	1.520	0.14800
rteacher	-3.424028	1.530232	-2.238	0.03983 *
eyear	-16.168661	4.191807	-3.857	0.00139 **
expend	4.506369	5.685975	0.793	0.43964

Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 24.44 on 16 degrees of freedom
 (40 observations deleted due to missingness)
 Multiple R-squared: 0.76, Adjusted R-squared: 0.67
 F-statistic: 8.445 on 6 and 16 DF, p-value: 0.0003067

Call:

```
lm(formula = ps ~ internet + mobile + log(GDPperc) + log(pop) +  
    popd + rteacher + eyear + expend, data = data)
```

Residuals:

Min	1Q	Median	3Q	Max
-37.389	-5.489	-0.126	12.811	30.420

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	201.179611	104.075976	1.933	0.0737 .
internet	1.561277	0.624799	2.499	0.0255 *
mobile	0.125213	0.222887	0.562	0.5832
log(GDPperc)	16.217979	8.606442	1.884	0.0804 .
log(pop)	8.666553	4.288148	2.021	0.0628 .
popd	0.002592	0.002470	1.049	0.3118
rteacher	-1.065455	1.667119	-0.639	0.5331
eyear	-11.385740	4.210679	-2.704	0.0171 *
expend	-2.767786	5.850844	-0.473	0.6435

Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 21.7 on 14 degrees of freedom
 (40 observations deleted due to missingness)
 Multiple R-squared: 0.8344, Adjusted R-squared: 0.7397
 F-statistic: 8.817 on 8 and 14 DF, p-value: 0.0002568

Analysis

According to the result, in the second regressio, these variables are statistically significant. - Math:GDP per capita - Reading: GDP per capita, expenditure - Problem solving: GDP per capita, population, pupils-teacher rate and duraion educational year in elementary

In the third regression, GDP per capita is not statistically significant any more. Instead of GDP per capita, the number of internet users and population become statistically significant.

Especially, the number of internet users is significant at 0.1% level in math and reading. We can see it bring plus effect on the both score.However, regarding the problem solving, internet is statistically significant only at 5 % level and the effect is weaker than other 2 scores.

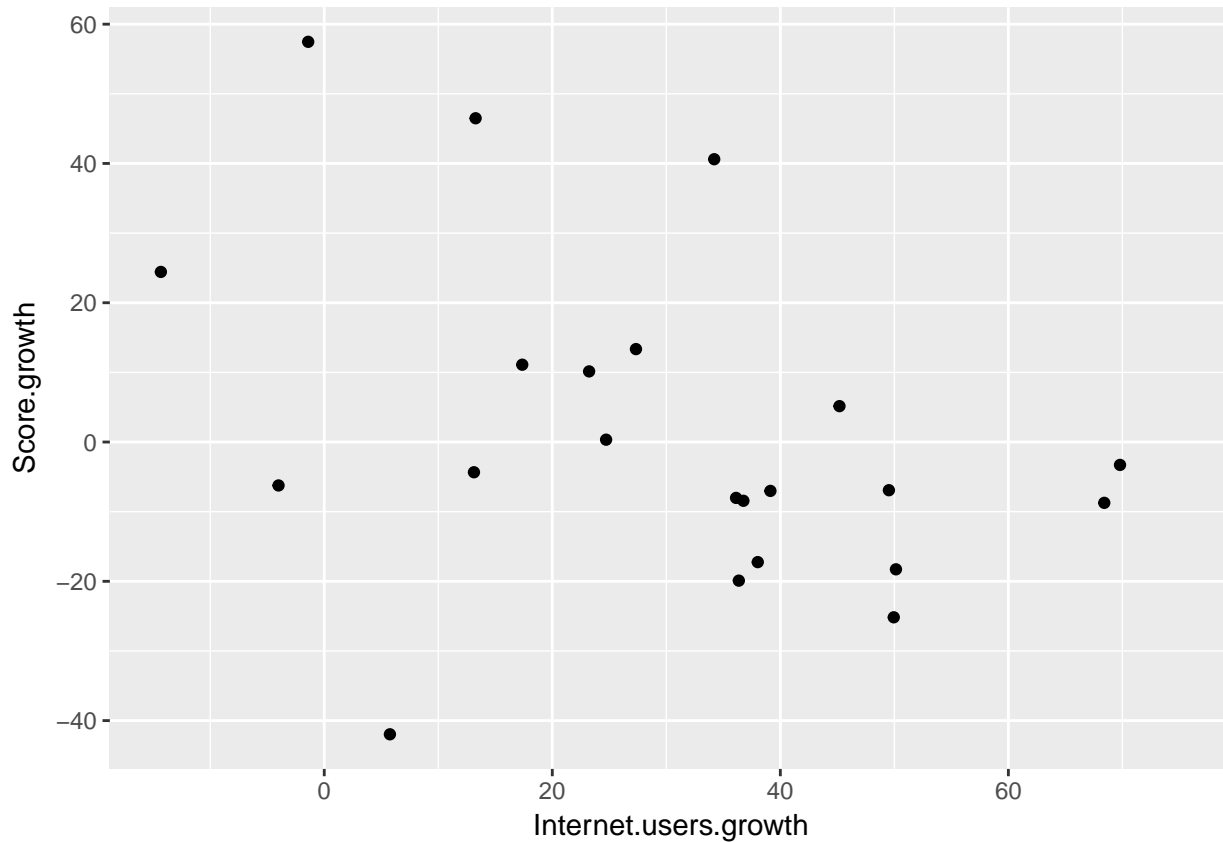
In addition, regarding GDP per capita of math ane reading, it bring the minues effect on the both scores after the variable internet and mobile are added, though it still bring the plus effect on problem solving. Even though it is not statistically significant for math and reading, but it might possible to infer if the internet accessibility would be the same level, economically strong country's math and reading scores might be lower than economically weak countries.

Also, we noticed that about the academic ability (math and reading,) internet accessibility would bring the some impact on the scores. However, it would bring less impact on the problem solving ability.

Actually, there is some discussion that internet accessibility might bring reverse effect on student's thinking ability. Therefore, next we focus on the problem solving score.

Correlation between score growth

```
## Warning: Removed 33 rows containing missing values (geom_point).
```



```
##
## Call:
## lm(formula = Internet.users.growth ~ Score.growth, data = pisa)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -39.780  -8.265   1.494  12.432  38.128
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)   30.4856     4.4649   6.828 1.23e-06 ***
## Score.growth  -0.3587     0.1917  -1.872  0.0759 .
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 20.9 on 20 degrees of freedom
## (33 observations deleted due to missingness)
## Multiple R-squared:  0.1491, Adjusted R-squared:  0.1065
## F-statistic: 3.503 on 1 and 20 DF,  p-value: 0.07594
```

The result shows that we cannot find any correlation between internet accessibility growth and score growth....