Assignment 1 for Data Analysis 2 and Coding with R

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Link to my github repo https://github.com/Paulinebrsl/Assignment-1.

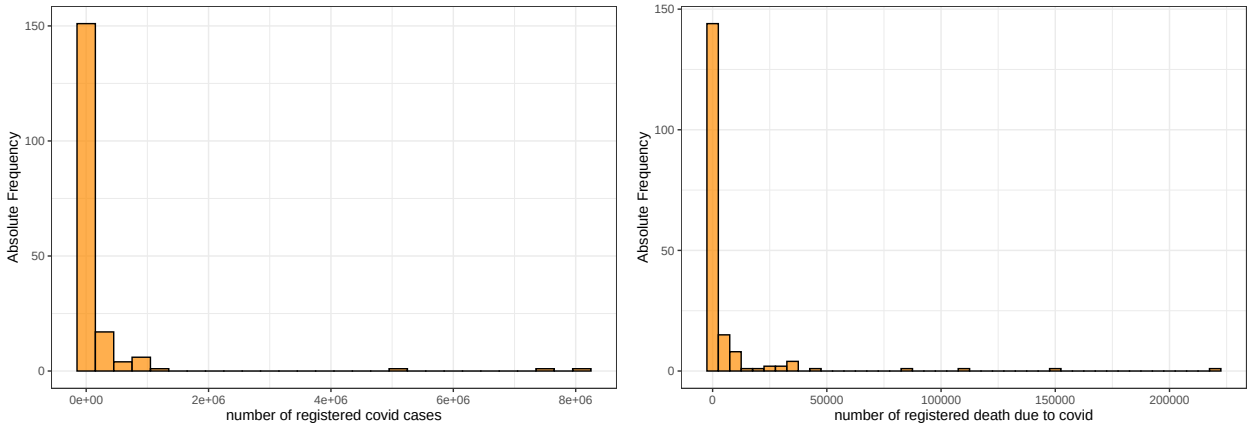
We analyse covid data collected by CSSE at Johns Hopkins University and population data for 2019 from World Bank (using WDI). The dataset contains 182 countries and registers the number of confirmed covid-19 cases and number of death due by covid on 15/10/2020. One potential data quality issue is that there are different policies on covid testing in each country,sometimes this may not reflect the actual number of cases. A potential data quality issue are te different ways in each country to test and report confirmed covid-19 cases, plus asymptomatic cases who did not take a test.

Research question: What is the pattern of association between registered covid-19 cases and registered number of death due to covid-19? In order to find out we will estimate regression models, our outcome variable (y) is the **number of registered death due to covid** and our explanatory variable (x) is the **number of registered covid cases**.

1. Summary statistics and Distribution for x and y

Table 1: Summary for the number of registered death caused by covid and registered covid cases

mean	median	min	max	std	variable
213757	16483.0	3	7983919	899396	confirmed cases
6032	281.5	0	217883	22934	nb of death



The "Confirmed" variable is the count of confirmed covid cases reported for one day and for each country. "Death" variable is the count of reported death due to covid for one day and for each country. Both distributions are skewed with long right tails. The 2 modes are located on low values, but we see that there

are a few extreme values.

Table 2: Extreme values

country	confirmed	death	recovered	active	population
Brazil	5169386	152460	4526393	490533	211049527
India	7370468	112161	6453779	804528	1366417754
United States	7983919	217883	3177397	NA	328239523

We check countries which recorded confirmed covid cases above 2 milion and registered death above 50,000. These are India, Brazil and United States, which are not measurement errors. We keep these values.

2. Pattern of association

We check the possible different ln transformation for the variables with plotting different scatterplots with lowess. Graphs are available in the appendix. For the simple model without scaling and for the level-log model, the pattern is non-linear, most of observations are concentrated on the bottom and there are some extreme observations corresponding to Brazil, US and India.

Instead, the model with the log of confirmed cases and log of death creates a linear association.

- Substantive reasoning: easier to interpret.
- Statistical reasoning: it gives a better approximation to the average slope of the pattern. We should use the log-log transformation, which is the only to provide a linear pattern. We create new variables for log of the two variables: ln_confirmed and ln_death .

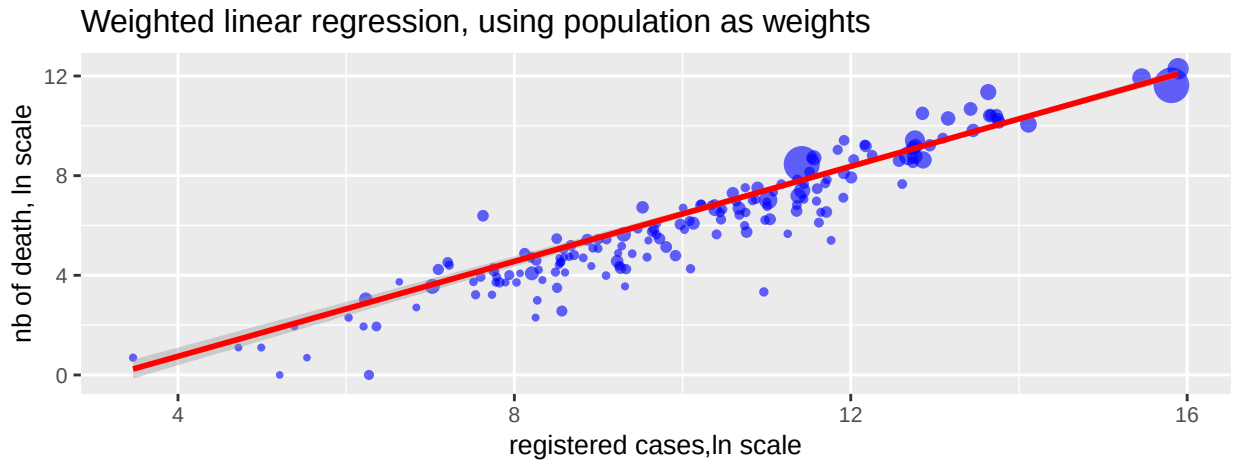
3. Estimating different models

We estimate four different regression models: Simple linear regression, Quadratic regression, Piecewise linear spline regression and Weighted linear regression using population as weights. The estimated model results and scatter plot visualization are reported in the appendix.

Based on model comparison we choose **Weighted linear regression model, using population as weights** (reg4): ln_death = alpha + beta * ln_confirmed, weights: population. This regression has the higher R-squared out of the 4 models, which is 0.928. The slope for our chosen model is 0.953. The model is interpreted in appendix.

	Weighted linear regression, using population as weights
(Intercept)	-3.07^{***}
	(0.26)
ln_confirmed	0.95^{***}
	(0.02)
R^2	0.93
Adj. R^2	0.93
Num. obs.	170

$^{***}p < 0.001$; $^{**}p < 0.01$; $^{*}p < 0.05$



4. Hypothesis Test and Analysis of the residuals

We test our Beta parameter, carrying out the fellowing test: H0 :Beta=0, HA :Beta neq 0. The estimated t-statistics is 14.98, with p-value: 9.286e-33. We choose the 5% significance level. Thus we reject the null hypothesis, which means that the coefficient is significative and that there is a correlation link between the number of recorded death due to covid and the number of confirmed covid cases.

Table 3: Countries with largest negative error

country	ln_death	reg4_y_pred	reg4_res
Burundi	0.000000	2.910794	-2.910794
Iceland	2.302585	4.799315	-2.496730
Qatar	5.402677	8.148109	-2.745432
Singapore	3.332205	7.385913	-4.053708
Sri Lanka	2.564949	5.097056	-2.532107

Table 4: Countries with largest positive error

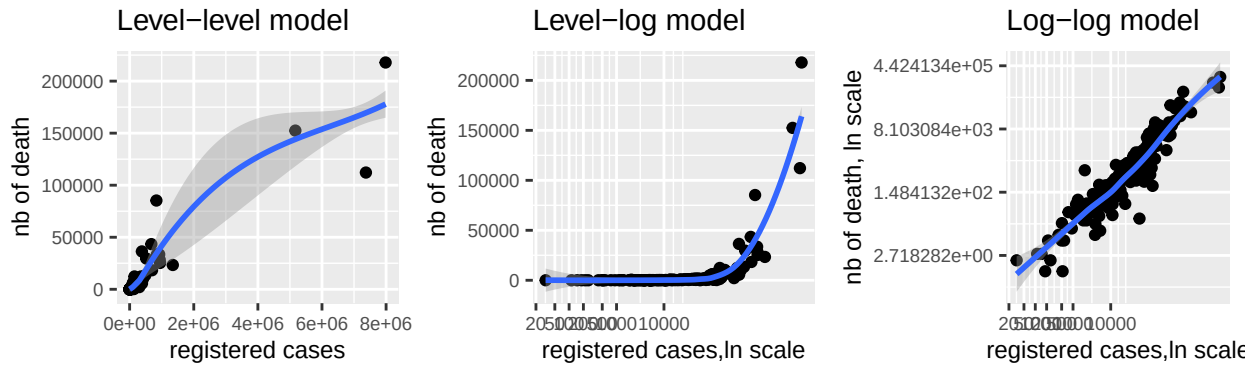
country	ln_death	reg4_y_pred	reg4_res
Ecuador	9.417842	8.295599	1.1222430
Italy	10.501554	9.183262	1.3182927
Mexico	11.353754	9.929485	1.4242690
United Kingdom	10.677823	9.728898	0.9489249
Yemen	6.390241	4.203259	2.1869819

Executive Summary

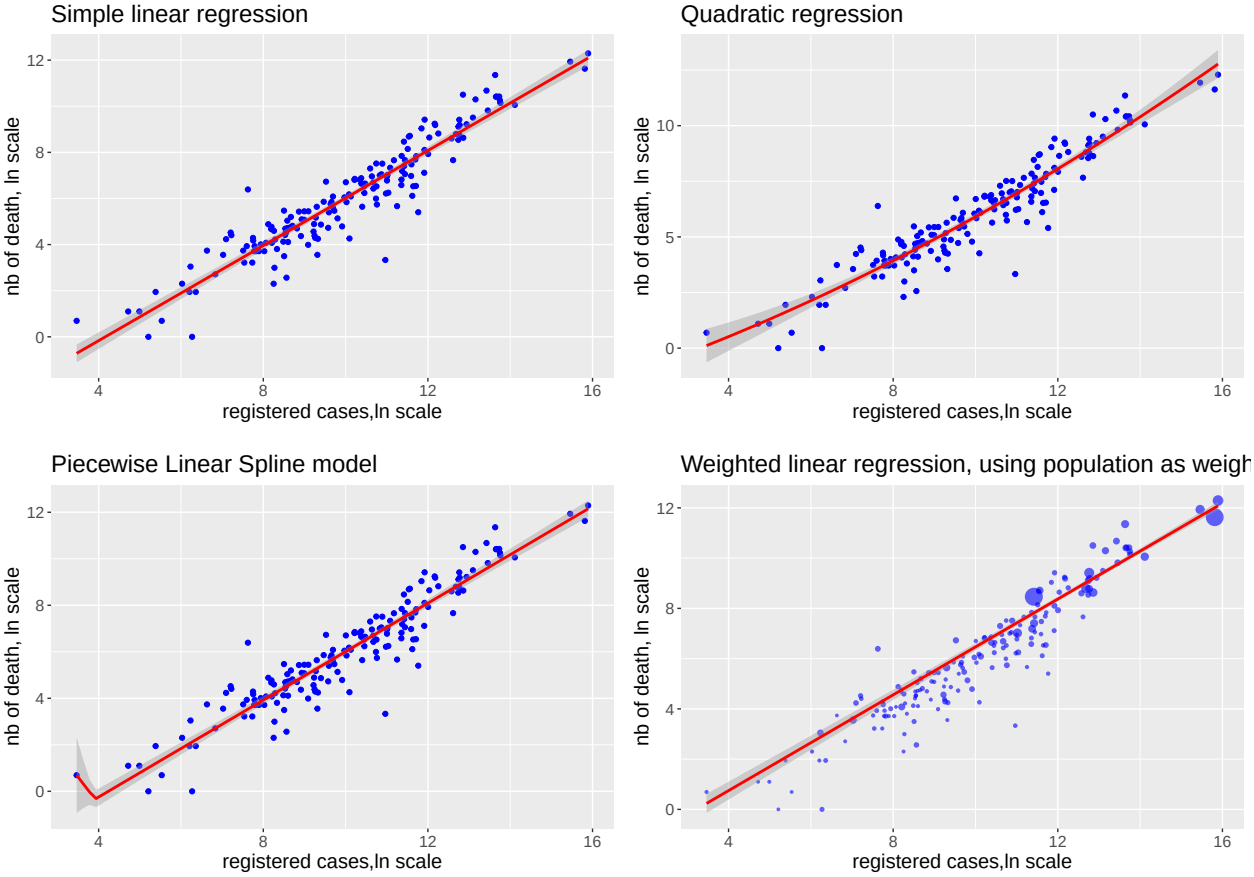
We investigated registered death due to covid and number of confirmed covid cases pattern of association. We used the model of Weighted linear regression, using population as weights. The slope for our chosen model is 0.953. This shows that countries with 10% more recorded covid cases have on average 9.5% more death due to covid. This means that the number of registered death due to covid and the number of registered covid cases are positively correlated. The analysis helps us to identify countries with unexpectedly low and high mortality number due to covid.

Appendix

Pattern of association



Estimating regression models



Regression report

% Table created by stargazer v.5.2.2 by Marek Hlavac, Harvard University. E-mail: hlavac at fas.harvard.edu
% Date and time: Dim, nov 29, 2020 - 12:18:03

Table 5: Modelling number of registered death due to covid and number of confirmed covid cases

	Dependent variable:			
	ln_death			
	Linear model	Quadratic model	PLS model	Weighted linear model
	(1)	(2)	(3)	(4)
ln_confirmed	1.031*** (0.028)	0.583*** (0.178)		0.953*** (0.020)
ln_confirmed_sq		0.022** (0.009)		
lspline(ln_confirmed, cutoff_ln)1			−2.309 (1.887)	
lspline(ln_confirmed, cutoff_ln)2			1.042*** (0.029)	
Constant	−4.290*** (0.291)	−2.176** (0.880)	8.694 (7.343)	−3.066*** (0.260)
Observations	170	170	170	170
R^2	0.887	0.892	0.889	0.928
Adjusted R^2	0.887	0.890	0.888	0.928
Residual Std. Error	0.826 (df = 168)	0.813 (df = 167)	0.821 (df = 167)	4,289.901 (df = 168)
Note:				*p<0.1; **p<0.05; ***p<0.01

- Linear model:The R-squared is 0.887. The "constant" is the intercept of the model and is equal to -4.290. The slope for this model is 1.031. This shows that countries with 10% more recorded covid cases have on average 10,3% more death due to covid.
- Quadratic model:The R-squared is 0.892. The Beta1 for this model is 0.583, and Beta2 is 0.022. The intercept is -2.176. The coefficients are difficult to interpret.
- Regression with Piecewise Linear Spline: This model captures the flattening of the regression line at the start: knot at ln(4) registered cases. The R-squared is 0.889. The Beta1 for this model is -2.309, and Beta2 is 1.042. The four R-squared are pretty high and there is a little variation between the models. Beta1 : When comparing observations with less registered cases than ln(4), y is 2.309 lower on average, for observations with one unit more registered cases. Beta2 : When comparing observations with more registered cases than ln(4), y is 1.042 higher on average, for observations with one unit more registered cases.
- Chosen model: Based on model comparison we choose Weighted linear regression model, using population as weights (reg4): ln_death = alpha + beta * ln_confirmed, weights: population. This model weights the importance of each observation on population. This regression has the higher R-squared out of the 4 models, which is 0.928. The slope for our chosen model is 0.953. This shows that countries with 10% more recorded covid cases have on average 9.5% more death due to covid. The coefficients can be well interpreted and an advantage is that the scatterplot for weighted regression shows the size of each country as the circles are proportionate to the population.

Analysis of the residuals

- Countries with the lowest number of death due by covid given their number of registered covid cases are Burundi, Iceland, Quatar, Singapore and Sri Lanka. With an average coefficient around 2,7.
- Countries with the highest number of death due by covid given their number of registered covid cases are Ecuador, Italy, Mexico, UK and Yemen. With an average coefficient around 9,7.