

FIT3152 Assignment 1 Report

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Question 1a

The dataset contains 50,000 rows and 40 columns, with each row representing an individual's social, political, economic, religious, or cultural values from various countries. Most of the attributes are ordinal variables that have been coded numerically, meaning they represent ranked categories and are treated as numeric for analysis purposes, like TPeople, TFamily, and TNeighbourhood. There is also one continuous numerical variable (Age), and one text variable (Country), which identifies the respondent's country of residence.

Initially, some of the ordinal attributes had negative values, like -1 to -5, which according to the CodeBook Variables report, these values represent that it is unanswered. These values

were handled and are coded as NA. The total number of missing values (NA) is 37,964, with the total number of missing values per column shown in Appendix *Figure1a.1*.

In terms of distribution of the dataset’s numerical attributes (excluding the “Age” column) in *Figure 1a.2*, most columns are on a similar scale, ranging from 1 to 10, while others range from 1 to 4 and the “Edu” column ranging from 0-8. The column names having the prefix “C”, like CReligious and CPolice, show little variations, with tightly packed boxes and short whiskers, suggesting that responses cluster around a central value. The outliers here represent individuals with very different opinions from the majority and it can be seen in columns like TFamily, TKnow, and PTelevision. TPeople, TNeighbourhood, and TKnow tend to have lower median values and narrower interquartile ranges, suggesting that respondents generally rate these lower.

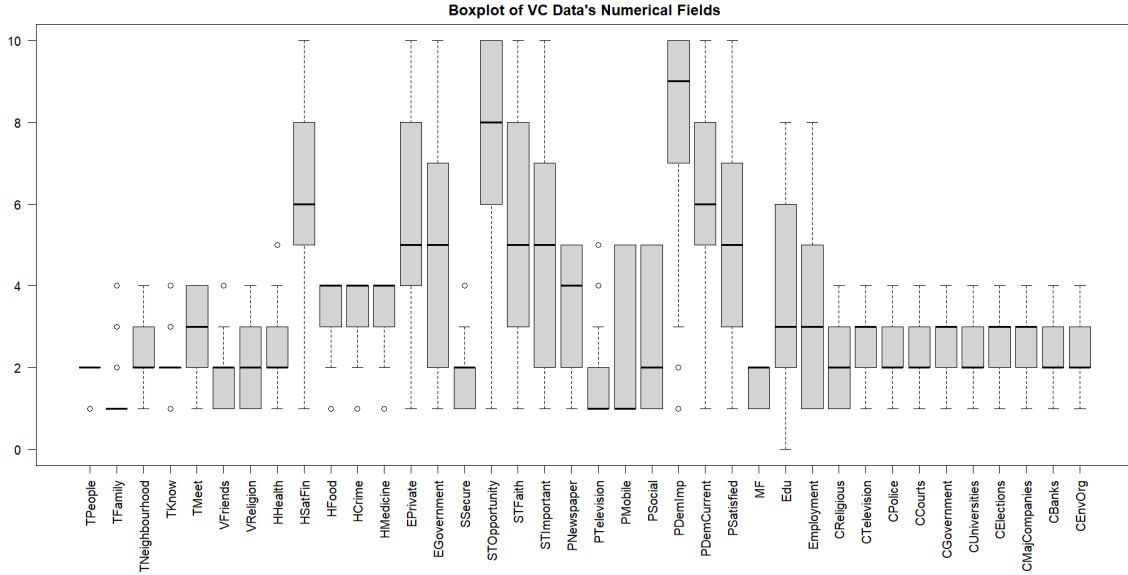


Figure 1: *Figure 1a.2: Distribution of Numerical Attributes (Excluding ‘Age’ Attribute)*

For the “Age” column distribution shown in Figure 1a.2, it is positively skewed since it has a longer whisker at the right end, suggesting that the respondents are generally younger. There are a few outliers at the right end, suggesting that there are individuals that are much older than most respondents.

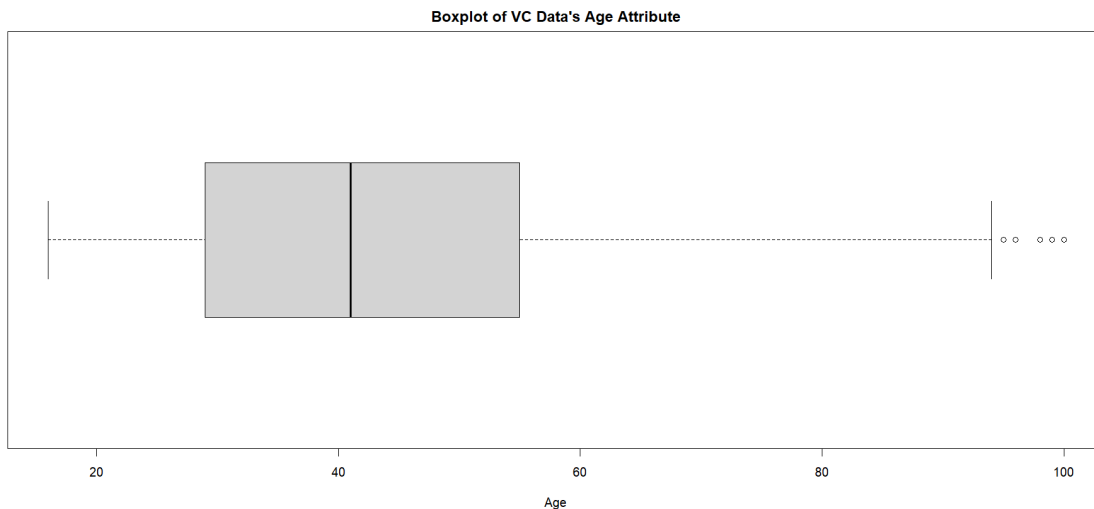


Figure 2: *Figure 1a.3: Distribution of Numerical Attribute (Age)*

In terms of the variety of the “Country” column shown in Figure 1a.4, the dataset contains responses from a wide range of countries, but the number of responses is unevenly distributed. While some countries contribute a lot of responses (more than 2000), others have much fewer (around 500). This could affect the representativeness of the data across countries, and it is something to keep in mind during analysis - especially for clustering or country-based comparisons.

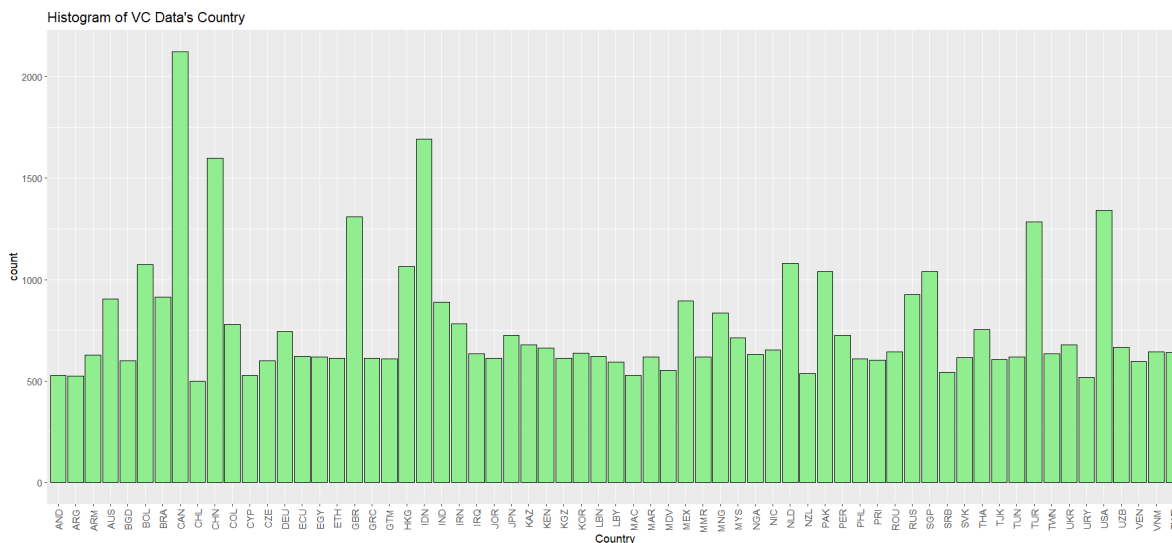


Figure 3: *Figure1a.4: Variety of Non-numerical Attribute (Country)*

Question 2a

The focus country given was Singapore (SGP), 2 subsets of the dataset were created to compare the data of Singapore versus other countries. The Singapore dataset contains 1040 rows and 40 columns.

Comparing the distribution of Singapore's and other countries' numerical attributes (excluding the 'Age' column) shown in Figure 2a.1 and Figure 2a.2 respectively, all columns in Figure 2a.1 generally have a narrower interquartile range with 30% of the columns in Figure 2a.1 having very narrow interquartile ranges.

For example, HFood, HCrime, and HMedicine for both figures have the similar median values, but for Singapore, all three columns have a very small interquartile range, indicating that unlike other countries, majority of Singaporeans have never gone without enough food to eat, or felt unsafe from crime in their own home, or gone without needed medicine or treatment that they needed in the last 12 months. To prove this difference, a t-test was done between the HCrime columns of Figure 2a.1 and 2a.2. The p-value obtained is $2.2e-16$ which is smaller than 0.05 and this provides strong evidence against the null hypothesis that Singaporeans and other countries' individuals feel the same about their safety from crime in their own home.

However, the VReligion column's distribution for both figures can be said to look similar as they have similar median values and interquartile ranges. To prove this similarity, a t-test was done between the VReligion columns of Figure 2a.1 and 2a.2. The p-value obtained is 0.0001173 which is not smaller than 0.05 and hence do not provide strong evidence against the null hypothesis that Singaporeans and other countries' individuals have the same opinions on the importance of religion in life.

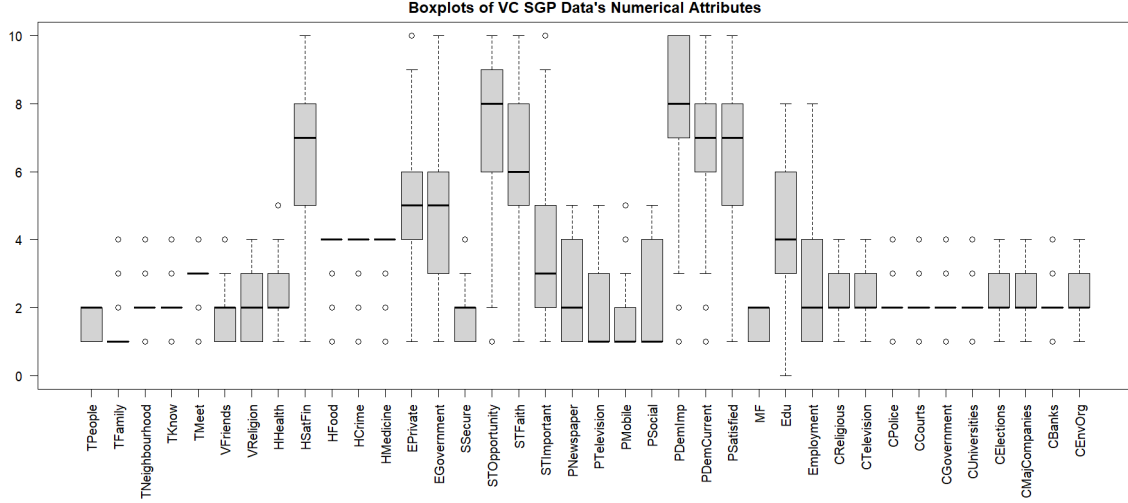


Figure 4: *Figure 2a.1: Distribution of Numerical Attributes for VC Focus Country (SGP) Data (Excluding 'Age' Attribute)*

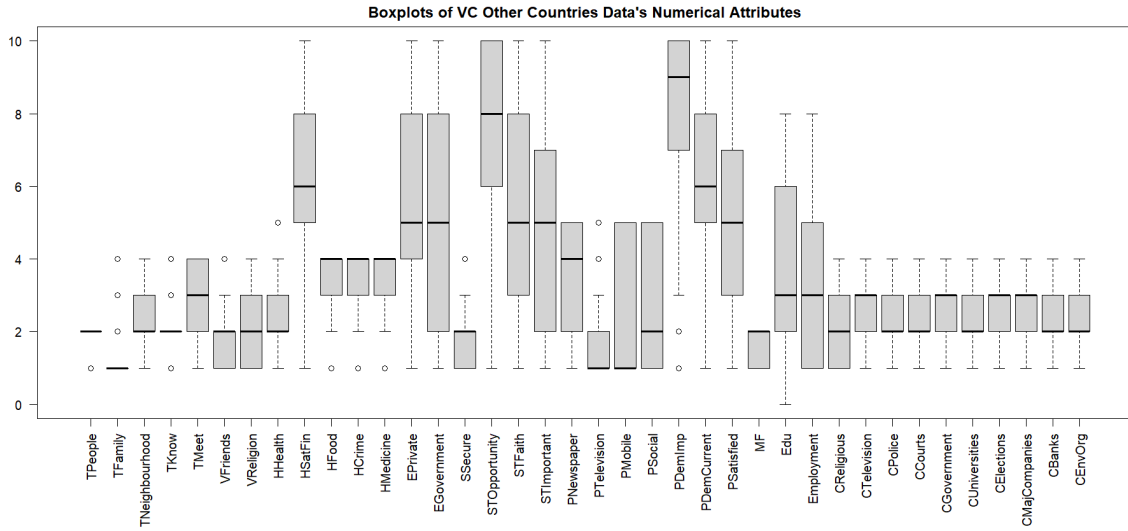


Figure 5: *Figure 2a.3: Distribution of Numerical Attributes for VC Non-Focus Countries Data (Excluding 'Age' Attribute)*

Comparing Figure 2a.3 and 2a.4, the age distribution of Singapore has a smaller range with no outliers, but a wider interquartile range. The median of age in Singapore is also larger and more symmetrical compared to other countries. This indicates that Singaporeans are much younger than other countries' individuals in this dataset.

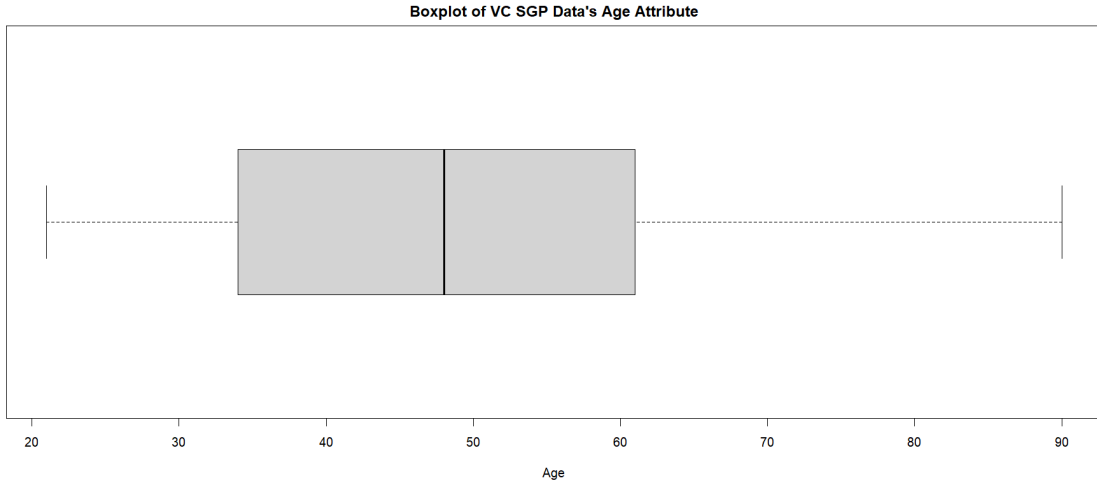


Figure 6: *Figure 2a.3: Distribution of Numerical Attribute (Age) for VC Focus Country (SGP) Data*

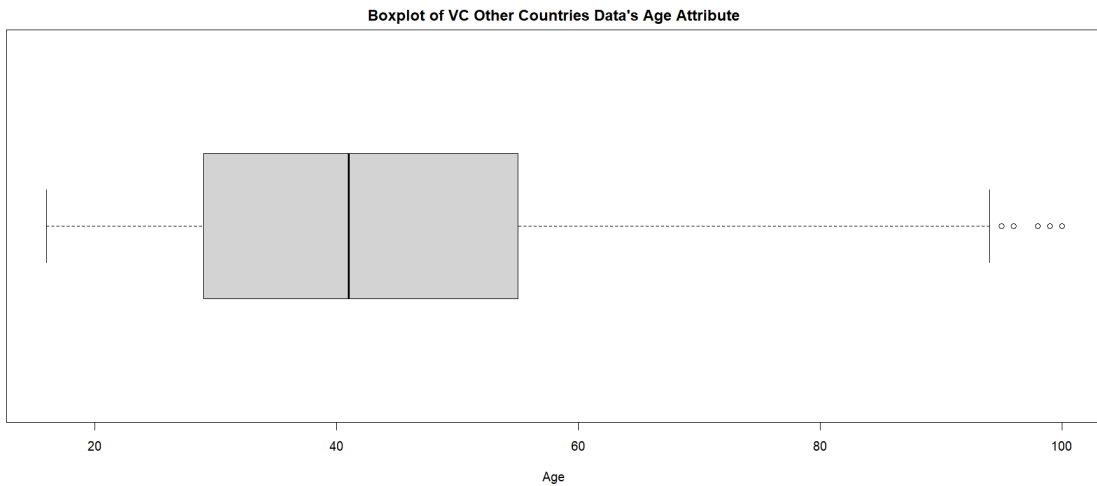
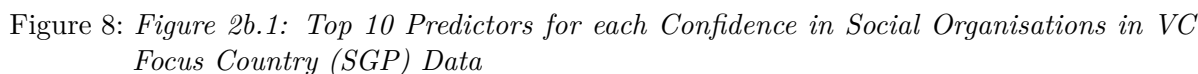


Figure 7: *Figure 2a.4: Distribution of Numerical Attribute (Age) for VC Non-Focus Countries Data*

Question 2b

Linear regression of attributes was fitted to each confidence in social organisations for Singapore. The top-10 smallest p-values were extracted and shown in Figure 2b.1.

With these two good predictors, the confidence in government can be more reliably predicted. This is because both predictors are in the top-2 for CGovernment according to Figure 2b.1, which indicates high accuracy in prediction. Although confidence in elections also have both predictors in their top-2, CGovernment has more predictors with p-values < 0.05 when comparing all top-10 predictors of CGovernment and CElections.



Linear regression of attributes was fitted to each confidence in social organisations for other countries. The top-10 smallest p-values were extracted and shown in Figure 2c.1.

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Comparing the predictors for Singapore and other countries, both have SSecure and PSatisfied as their strongest predictor, which further proves that SSecure and PSatisfied are consistent and strong predictors. As for Edu and TNeighbourhood, it is evident that these attributes are not consistently strong in Singapore as only a few confidence values have p-values < 0.05 for these attributes.

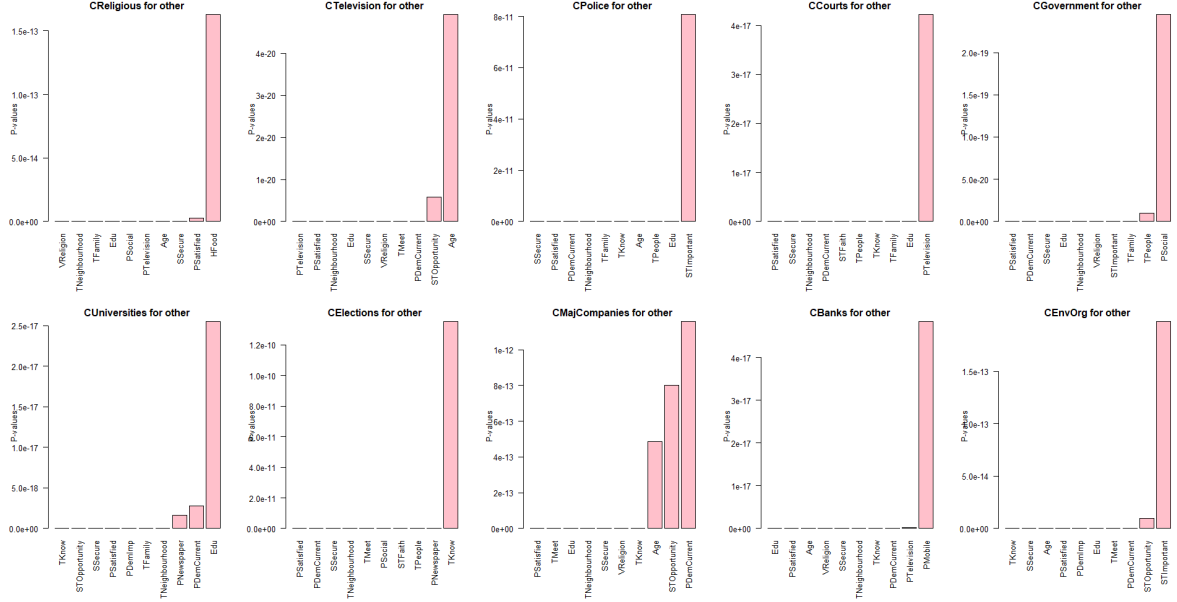


Figure 9: *Figure 2c.1: Top 10 Predictors for each Confidence in Social Organisations in VC Non-Focus Countries Data*

Question 3a

External data, “Global Country Data Set 2023”, from Kaggle was chosen. The data was filtered and cleaned to extract the wanted indicators only. The indicators chosen from the data for analysis were Birth Rate, CO2 Emissions, Consumer Price Index (CPI), Fertility Rate, Gasoline Price, GDP, Gross Primary Education Enrollment, Gross Tertiary Education Enrollment, Infant Mortality, Life Expectancy, Maternal Mortality Ratio, Out of Pocket Health Expenditure, Physicians per thousand, Labour Force Participation in the Population, and Unemployment Rate of countries world-wide.

Before performing k-means clustering, the numerical data was scaled so that all variables had the same weight, since k-means is sensitive to different units. Then, a range of k-values (2 to 16) was used to compute the average silhouette scores and plotted it as a line graph shown in Appendix Figure 3a.1. The k-value with the highest score was chosen as the optimal number of clusters. After that, k-means clustering was performed using this optimal k-value, and the resulting cluster labels were factored. Finally, the results were visualized using the

“fviz_cluster()” functions from the “factoextra” package. The “ggrepel” package was also used to make the cluster plot labels clearer and easier to read. The cluster plot is shown in Appendix Figure 3a.2.

Question 3b

The similar countries to Singapore were chosen from the zoomed-in cluster plot shown in Appendix Figure 3a.3, and it includes Uruguay (URY), Netherlands (NLD), New Zealand (NZL), Cyprus (CYP), and Chile (CHL). The linear regression of all attributes was fitted to each confidence in social organisations for all similar countries and the top-10 smallest p-values for each confidence value is shown in Figure 3b.1.

Overall, the strongest predictor is the SSecure attribute because it is in top-4 for all confidence values with a p-value < 0.05 . PSatisfied is not the strongest predictor as CReligious and CEnvOrg have a p-value > 0.05 for this attribute. Similarly to Singapore, the confidence in government can be more reliably predicted since 9 out of 10 of its attributes’ p-values are < 0.05 , making them strong predictors for this confidence value.

Comparing between Figure 3b.1 and Figure 2c.1, the difference is that the strongest predictors in Figure 3b.1 only include SSecure and PSatisfied attributes. Thus, it can conclude that the cluster of similar countries gives a better match to the important attributes for predicting confidence in social organisations in Singapore. This may be because countries with similar cultural and societal norms tend to have similar patterns in how individual attitudes influence institutional trust. In contrast, when looking at all other countries combined, the predictors are more varied and less aligned with the context of Singapore, likely due to greater diversity in views on institutional trust. This highlights that clustering based on similarity allows for more context-specific insights and more reliable predictions regarding confidence in social organisations.

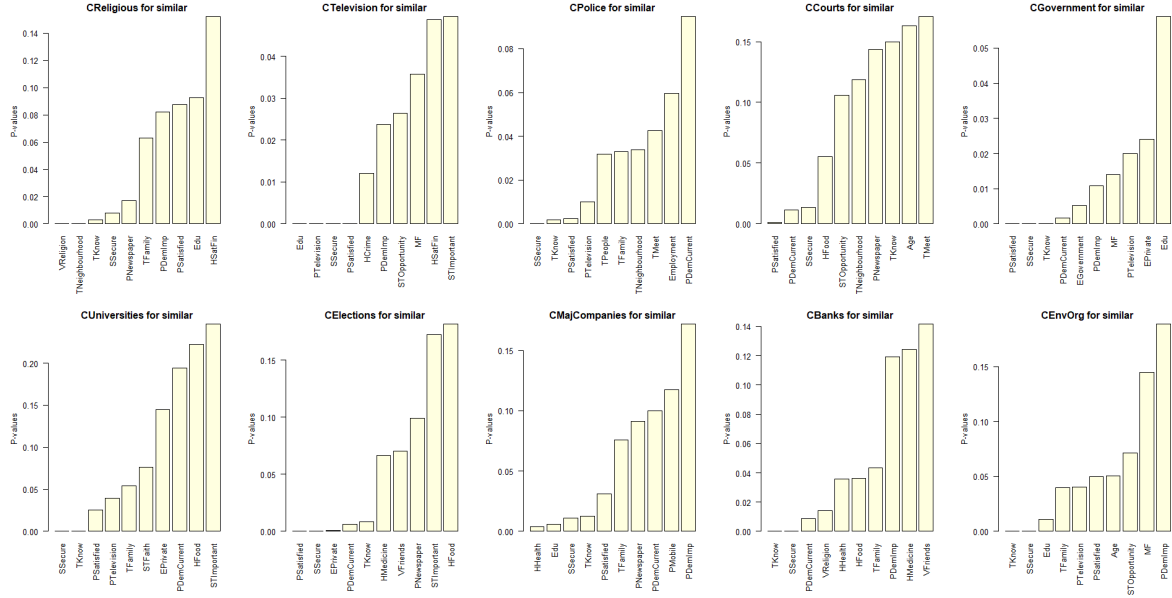


Figure 10: *Figure 3b.1: Top 10 Predictors for each Confidence in Social Organisations in VC Similar Countries to Focus Country (SGP) Data*

References

Elgiriye withana, N. (2023). *Global country information dataset 2023*.

<https://doi.org/10.34740/KAGGLE/DSV/6101670>

Appendix

Question 1a code

```
rm(list = ls())

set.seed(33214476)

VCData = read.csv("WVSEExtract.csv")

VC = VCData[sample(1:nrow(VCData),50000, replace=FALSE),]

VC = VC[,c(1:6, sort(sample(7:46,17, replace = FALSE)), 47:53,
sort(sample(54:69,10, replace = FALSE)))]
```

```
# Handling of missing values
for (col in names(VC)) {
  VC[[col]][VC[[col]] %in% c(-1, -2, -3, -4, -5)] <- NA
}

na_count <- sum(is.na(VC))

na_count
```

```
[1] 37964
```

```
missing_values_df <- data.frame(
  missing_count = sapply(VC, function(x) sum(is.na(x)))
)

# Dimension of VC
dim(VC)
```

```
[1] 50000    40
```

```
ncol(VC)
```

```
[1] 40
```

```
nrow(VC)
```

```
[1] 50000
```

```
# Data types
data_types_df <- data.frame(
  data_type = sapply(VC, function(x) if (is.numeric(x) && length(unique(x)) <= 11) "Ordinal"
)

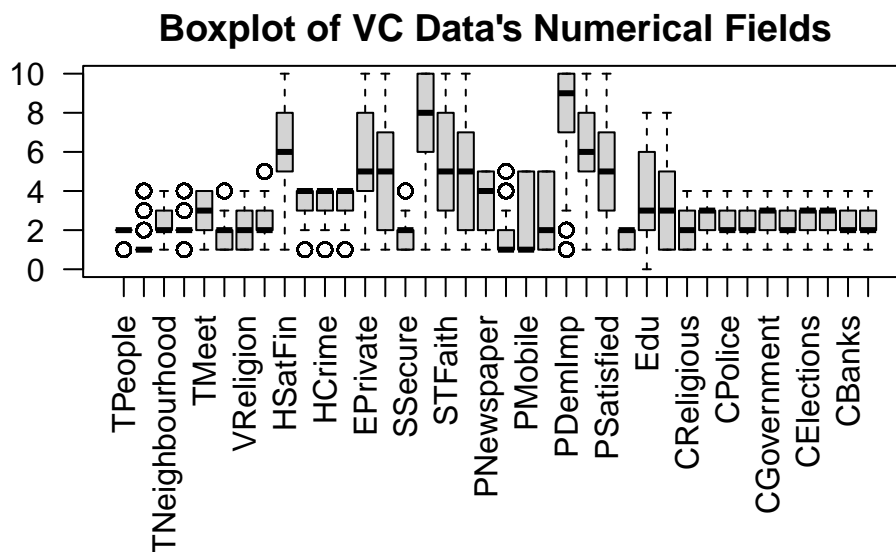
head(data_types_df)
```

	data_type
Country	Text
TPeople	Ordinal

TFamily	Ordinal
TNeighbourhood	Ordinal
TKnow	Ordinal
TMeet	Ordinal

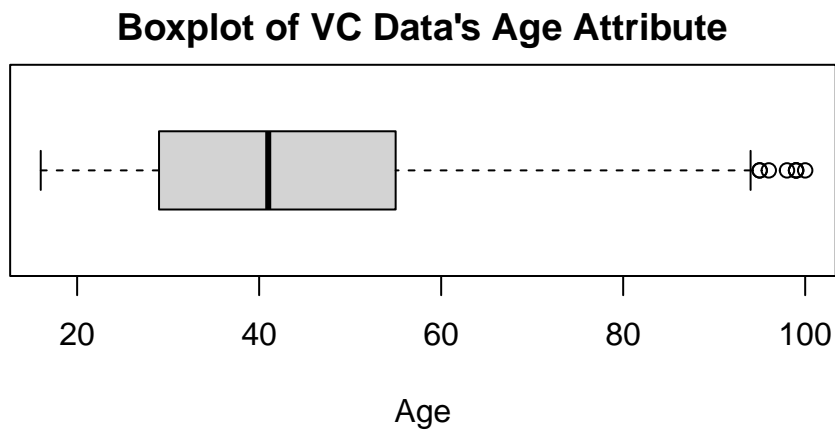
```
# Boxplots of numerical attributes
par(mar=c(10, 4, 2, 2))

boxplot(VC[, c(2:27, 29:40)], las=2, main="Boxplot of VC Data's Numerical Fields")
```



```
boxplot(VC[, 28], las=1, horizontal = TRUE, main="Boxplot of VC Data's Age Attribute", xlab = "Age")

# Histogram of non-numerical attribute
library(ggplot2)
```



```
VC_country_hist <- ggplot(VC, aes(x=Country)) +
  geom_histogram(stat="count", binwidth = 3, color = "black", fill = "lightgreen") +
  ggtitle("Histogram of VC Data's Country") +
  theme(axis.text.x = element_text(angle = 90, vjust = 0.5, hjust = 1))
```

Question 2a code

```
# Extraction of data for focus country and non-focus countries
VC_SGP = VC[VC$Country == "SGP",]

VC_other_countries = VC[VC$Country != "SGP",]

# Dimension of data sets
dim(VC_SGP)
```

```
[1] 1040    40
```

```
dim(VC_other_countries)
```

```
[1] 48960    40
```

```
# Summary of data sets for comparison
head(VC_SGP)
```

	Country	TPeople	TFamily	TNeighbourhood	TKnow	TMeet	VFriends	VReligion
60167	SGP	1	1		2	2	3	2
48871	SGP	2	1		1	1	2	1
28836	SGP	2	2		2	2	2	1
71135	SGP	1	3		2	2	3	2
56212	SGP	1	2		2	2	2	2
57486	SGP	1	1		2	2	3	2
	HHealth	HSatFin	HFood	HCrime	HMedicine	EPrivate	EGovernment	SSecure
60167	2	6	4	4	4	6	5	1
48871	3	9	4	4	3	5	5	1
28836	1	7	3	3	3	7	6	1
71135	2	5	4	4	4	6	6	1
56212	2	8	4	4	4	5	5	1
57486	2	9	4	4	4	5	6	1
	STOpportunity	STFaith	STImportant	PNewspaper	PTelevision	PMobile	PSocial	
60167	7	7	3	1	1	2	3	
48871	7	6	8	4	1	2	1	
28836	5	5	5	1	1	1	1	
71135	8	7	4	1	1	4	4	
56212	5	5	5	5	5	1	5	
57486	10	2	5	5	3	1	4	
	PDemImp	PDemCurrent	PSatisfied	MF	Age	Edu	Employment	CReligious
60167	7	7	7	1	58	3	1	1
48871	6	5	8	1	22	4	7	1
28836	8	8	5	1	39	3	2	1
71135	10	6	10	2	44	2	3	3
56212	NA	NA	NA	1	57	0	4	2
57486	8	10	8	1	37	7	1	3
	CTelevision	CPolice	CCourts	CGovernment	CUniversities	CElections		
60167	2	2	2	2	2	NA		
48871	3	1	1	2	2	2		
28836	1	1	1	1	1	1		
71135	2	1	2	1	2	1		
56212	2	2	2	2	2	2		
57486	3	1	2	2	2	2		
	CMajCompanies	CBanks	CEnvOrg					
60167	2	2	NA					
48871	3	2	2					
28836	1	1	1					

71135	1	1	2
56212	2	2	2
57486	3	3	3

```
head(VC_other_countries)
```

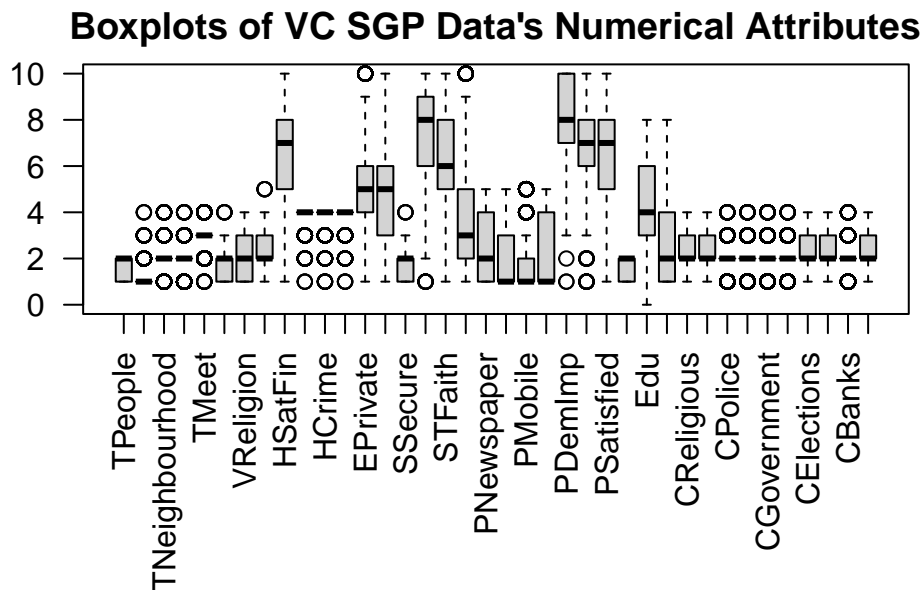
	Country	TPeople	TFamily	TNeighbourhood	TKnow	TMeet	VFriends	VReligion
7169	GRC	2	1		2	2	3	2
42276	IRN	2	1		3	2	3	3
38925	IRQ	2	1		1	2	3	1
1919	BRA	2	2		3	2	4	1
53733	GBR	1	2		2	2	3	4
64942	LBN	2	1		3	3	3	2
								1
	HHHealth	HSatFin	HFood	HCrime	HMedicine	EPrivate	EGovernment	SSecure
7169	2	5	4	4	4	4		3
42276	3	4	2	2	3	1		1
38925	2	5	3	3	3	8		3
1919	1	7	4	4	4	5		1
53733	3	7	4	4	2	7		3
64942	2	6	3	1	3	6		7
	STOpportunity	STFaith	STImportant	PNewspaper	PTelevision	PMobile	PSocial	
7169	8	8		4	1	2	1	1
42276	10	1		1	5	5	5	1
38925	9	9		3	5	1	1	1
1919	5	3		2	2	1	2	5
53733	5	1		1	5	2	5	1
64942	7	6		6	5	4	1	1
	PDemImp	PDemCurrent	PSatisfied	MF	Age	Edu	Employment	CReligious
7169	6		2	2	1	50	3	1
42276	8		2	5	1	23	4	7
38925	9		8	7	2	19	1	5
1919	10		4	1	2	65	6	3
53733	10		8	4	2	33	6	1
64942	8		5	6	1	36	1	1
	CTelevision	CPolice	CCourts	CGovernment	CUniversities	CElections		
7169	3	3	3		3	2		3
42276	4	2	3		3	2		3
38925	1	1	1		1	1		1
1919	2	2	3		4	2		2
53733	3	2	2		3	2		2
64942	3	3	3		3	3		3
	CMajCompanies	CBanks	CEnvOrg					

7169	2	4	2
42276	3	3	2
38925	1	1	1
1919	2	2	2
53733	3	2	3
64942	3	3	3

```
# Boxplots and histogram for distribution of numerical attributes for focus country and non-
par(mar=c(9, 4, 2, 2))

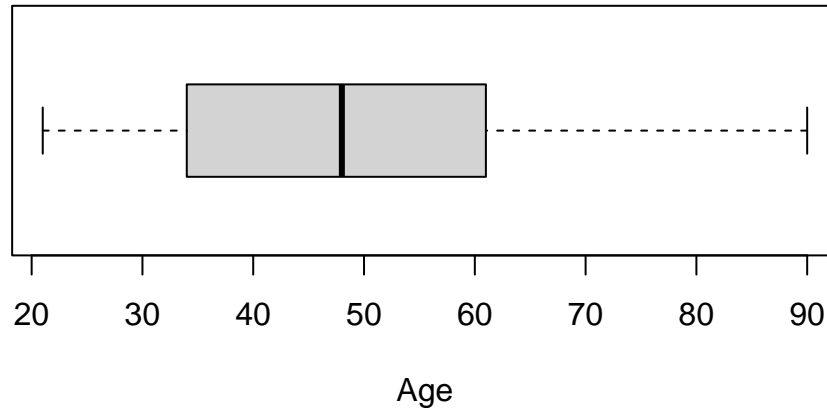
par(mar=c(9, 4, 2, 2))

boxplot(VC_SGP[, c(2:27, 29:40)], las = 2, main = "Boxplots of VC SGP Data's Numerical Attributes")
```



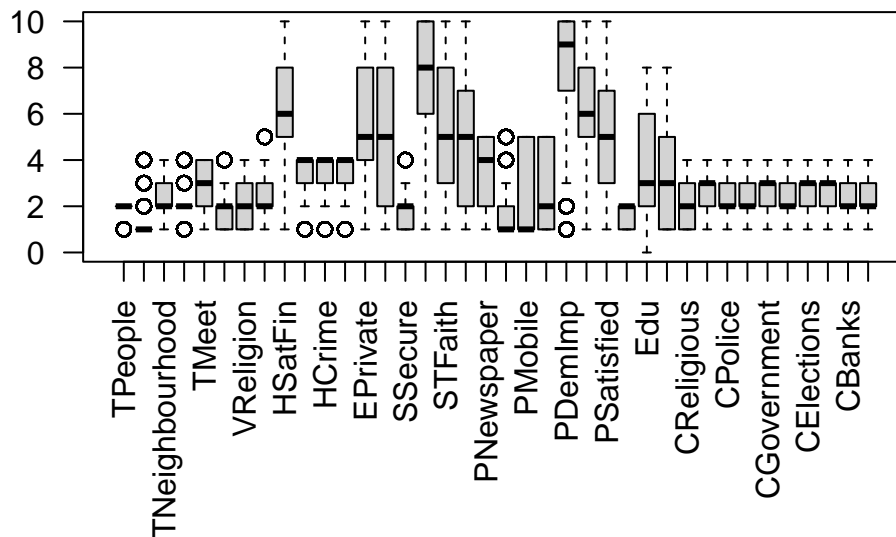
```
boxplot(VC_SGP[, 28], las=1, horizontal = TRUE, main="Boxplot of VC SGP Data's Age Attribute")
```

Boxplot of VC SGP Data's Age Attribute



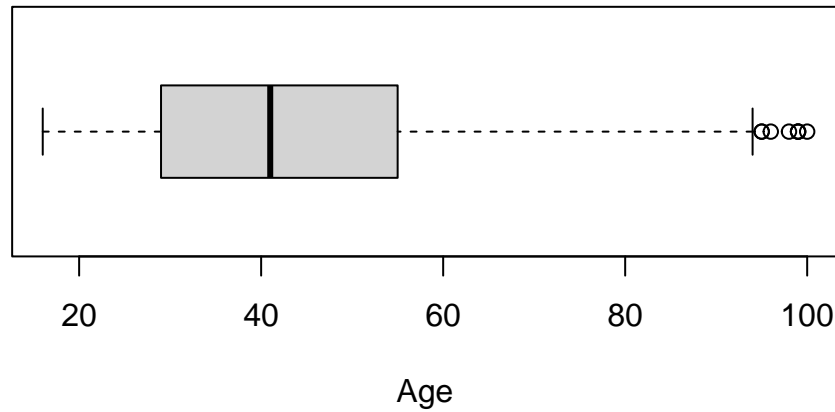
```
boxplot(VC_other_countries[, c(2:27, 29:40)], las = 2, main = "Boxplots of VC Other Countries")
```

Boxplots of VC Other Countries Data's Numerical Attributes



```
boxplot(VC_other_countries[, 28], las=1, horizontal = TRUE, main="Boxplot of VC Other Countries Data's Age Attribute")
```

Boxplot of VC Other Countries Data's Age Attribute



```
# t-Test for similarity or difference in numerical attributes for focus country and non-focus
t.test(VC_SGP$HCrime, VC_other_countries$HCrime, "two.sided", conf.level = 0.95)
```

Welch Two Sample t-test

```
data: VC_SGP$HCrime and VC_other_countries$HCrime
t = 24.512, df = 1188.7, p-value < 2.2e-16
alternative hypothesis: true difference in means is not equal to 0
95 percent confidence interval:
 0.3483795 0.4090009
sample estimates:
mean of x mean of y
 3.818882  3.440192
```

```
t.test(VC_SGP$VReligion, VC_other_countries$VReligion, "two.sided", conf.level = 0.95)
```

Welch Two Sample t-test

```

data: VC_SGP$VReligion and VC_other_countries$VReligion
t = 3.8658, df = 1088.3, p-value = 0.0001173
alternative hypothesis: true difference in means is not equal to 0
95 percent confidence interval:
 0.05911699 0.18098263
sample estimates:
mean of x mean of y
 2.10058 1.98053

```

Question 2b code

```

VC_SGP_numerical_attr = VC_SGP[, 2:40]

# Fitting linear regression for each confidence in social organisations in VC focus country
CReligious_SGP_fit = lm(CReligious ~.-CTelevision-CPolice-CCourts-CGovernment-CUniversities-CElections-CMajCompanies-CBanks-CEnvOrg)
CTelevision_SGP_fit = lm(CTelevision ~.-CReligious-CPolice-CCourts-CGovernment-CUniversities-CElections-CMajCompanies-CBanks-CEnvOrg)
CPolice_SGP_fit = lm(CPolice ~.-CReligious-CTelevision-CCourts-CGovernment-CUniversities-CElections-CMajCompanies-CBanks-CEnvOrg)
CCourts_SGP_fit = lm(CCourts ~.-CReligious-CTelevision-CPolice-CGovernment-CUniversities-CElections-CMajCompanies-CBanks-CEnvOrg)
CGovernment_SGP_fit = lm(CGovernment ~.-CReligious-CTelevision-CPolice-CCourts-CUniversities-CElections-CMajCompanies-CBanks-CEnvOrg)
CUniversities_SGP_fit = lm(CUniversities ~.-CReligious-CTelevision-CPolice-CCourts-CGovernment-CElections-CMajCompanies-CBanks-CEnvOrg)
CElections_SGP_fit = lm(CElections ~.-CReligious-CTelevision-CPolice-CCourts-CGovernment-CUniversities-CElections-CMajCompanies-CBanks-CEnvOrg)
CMajCompanies_SGP_fit = lm(CMajCompanies ~.-CReligious-CTelevision-CPolice-CCourts-CGovernment-CUniversities-CElections-CMajCompanies-CBanks-CEnvOrg)
CBanks_SGP_fit = lm(CBanks ~.-CReligious-CTelevision-CPolice-CCourts-CGovernment-CUniversities-CElections-CMajCompanies-CBanks-CEnvOrg)
CEnvOrg_SGP_fit = lm(CEnvOrg ~.-CReligious-CTelevision-CPolice-CCourts-CGovernment-CUniversities-CElections-CMajCompanies-CBanks-CEnvOrg)

# Analysing the linear regression fitted for each confidence in social organisation in VC focus country
summary(CReligious_SGP_fit)

```

Call:

```
lm(formula = CReligious ~ . - CTelevision - CPolice - CCourts -
    CGovernment - CUniversities - CElections - CMajCompanies -
    CBanks - CEnvOrg, data = VC_SGP_numerical_attr)
```

Residuals:

	Min	1Q	Median	3Q	Max
	-1.7054	-0.4144	0.0015	0.3933	2.3033

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	6.219e-01	4.004e-01	1.553	0.120785
TPeople	1.544e-02	5.329e-02	0.290	0.772141
TFamily	9.219e-02	4.950e-02	1.862	0.062919 .
TNeighbourhood	1.739e-01	4.789e-02	3.630	0.000301 ***
TKnow	1.397e-01	4.713e-02	2.964	0.003129 **
TMeet	-2.433e-02	4.176e-02	-0.583	0.560390
VFriends	-2.852e-02	3.855e-02	-0.740	0.459677
VReligion	3.146e-01	2.420e-02	13.001	< 2e-16 ***
HHealth	-5.412e-03	3.231e-02	-0.168	0.867011
HSatFin	-1.893e-02	1.321e-02	-1.434	0.152108
HFood	7.424e-02	7.077e-02	1.049	0.294495
HCrime	-4.556e-02	5.085e-02	-0.896	0.370555
HMedicine	-1.421e-02	6.340e-02	-0.224	0.822711
EPrivate	-8.142e-03	1.153e-02	-0.706	0.480291
EGovernment	1.339e-02	1.000e-02	1.338	0.181236
SSecure	1.089e-01	4.079e-02	2.669	0.007772 **
STOpportunity	1.809e-02	1.273e-02	1.421	0.155593
STFaith	-5.269e-03	1.010e-02	-0.522	0.601930
STImportant	-7.240e-04	1.047e-02	-0.069	0.944891
PNewspaper	3.843e-02	1.607e-02	2.392	0.016991 *
PTelevision	2.547e-02	1.882e-02	1.354	0.176198
PMobile	-1.885e-02	2.067e-02	-0.912	0.362114
PSocial	1.769e-02	1.829e-02	0.967	0.333848
PDemImp	2.522e-02	1.449e-02	1.741	0.082164 .
PDemCurrent	-2.265e-02	1.681e-02	-1.347	0.178251
PSatisfied	-2.782e-02	1.627e-02	-1.710	0.087704 .
MF	-1.667e-03	4.723e-02	-0.035	0.971855
Age	-4.576e-05	1.992e-03	-0.023	0.981677
Edu	2.612e-02	1.552e-02	1.683	0.092724 .
Employment	1.166e-02	1.139e-02	1.024	0.306129

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

Residual standard error: 0.6457 on 778 degrees of freedom
 (232 observations deleted due to missingness)
 Multiple R-squared: 0.3378, Adjusted R-squared: 0.3132
 F-statistic: 13.69 on 29 and 778 DF, p-value: < 2.2e-16

```
summary(CTelevision_SGP_fit)
```

Call:

```
lm(formula = CTelevision ~ . - CReligious - CPolice - CCourts -  
    CGovernment - CUniversities - CElections - CMajCompanies -  
    CBanks - CEnvOrg, data = VC_SGP_numerical_attr)
```

Residuals:

	Min	1Q	Median	3Q	Max
	-1.68760	-0.40151	-0.02371	0.43569	1.83608

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)	
(Intercept)	1.373e+00	3.699e-01	3.711	0.000221	***
TPeople	2.097e-02	4.923e-02	0.426	0.670239	
TFamily	2.705e-02	4.574e-02	0.591	0.554460	
TNeighbourhood	3.927e-02	4.425e-02	0.887	0.375092	
TKnow	7.432e-02	4.355e-02	1.707	0.088277	.
TMeet	6.381e-02	3.858e-02	1.654	0.098579	.
VFriends	3.999e-02	3.562e-02	1.123	0.261910	
VReligion	-1.997e-04	2.235e-02	-0.009	0.992874	
HHealth	5.123e-03	2.985e-02	0.172	0.863757	
HSatFin	2.408e-02	1.220e-02	1.974	0.048765	*
HFood	-2.300e-02	6.538e-02	-0.352	0.725147	
HCrime	1.181e-01	4.698e-02	2.515	0.012110	*
HMedicine	-8.545e-02	5.858e-02	-1.459	0.145062	
EPrivate	-1.045e-02	1.065e-02	-0.981	0.326911	
EGovernment	6.588e-05	9.243e-03	0.007	0.994315	
SSecure	1.533e-01	3.769e-02	4.068	5.23e-05	***
STOpportunity	-2.615e-02	1.176e-02	-2.224	0.026449	*
STFaith	1.421e-02	9.329e-03	1.523	0.128117	
STImportant	-1.903e-02	9.674e-03	-1.967	0.049492	*
PNewspaper	4.946e-03	1.484e-02	0.333	0.739057	
PTelevision	7.079e-02	1.739e-02	4.072	5.14e-05	***
PMobile	2.450e-02	1.910e-02	1.282	0.200078	
PSocial	4.079e-03	1.690e-02	0.241	0.809342	

PDemImp	3.032e-02	1.339e-02	2.265	0.023778	*
PDemCurrent	-2.089e-02	1.553e-02	-1.345	0.179043	
PSatisfied	-5.979e-02	1.503e-02	-3.977	7.63e-05	***
MF	-9.179e-02	4.363e-02	-2.104	0.035728	*
Age	1.196e-03	1.840e-03	0.650	0.515866	
Edu	9.182e-02	1.433e-02	6.405	2.60e-10	***
Employment	1.788e-02	1.052e-02	1.699	0.089626	.

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

Residual standard error: 0.5966 on 778 degrees of freedom
(232 observations deleted due to missingness)

Multiple R-squared: 0.2484, Adjusted R-squared: 0.2204

F-statistic: 8.868 on 29 and 778 DF, p-value: < 2.2e-16

```
summary(CPolice_SGP_fit)
```

Call:

```
lm(formula = CPolice ~ . - CReligious - CTelevision - CCourts -  
    CGovernment - CUniversities - CElections - CMajCompanies -  
    CBanks - CEnvOrg, data = VC_SGP_numerical_attr)
```

Residuals:

	Min	1Q	Median	3Q	Max
	-1.45966	-0.45414	0.04605	0.30873	2.41223

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)	
(Intercept)	1.3768680	0.3753589	3.668	0.000261	***
TPeople	0.1075058	0.0499553	2.152	0.031701	*
TFamily	0.0991565	0.0464058	2.137	0.032932	*
TNeighbourhood	0.0954778	0.0448966	2.127	0.033766	*
TKnow	0.1388301	0.0441836	3.142	0.001741	**
TMeet	-0.0794626	0.0391488	-2.030	0.042721	*
VFriends	0.0065152	0.0361418	0.180	0.856989	
VReligion	0.0218664	0.0226818	0.964	0.335319	
HHealth	-0.0350556	0.0302853	-1.158	0.247419	
HSatFin	-0.0047989	0.0123806	-0.388	0.698405	
HFood	0.1109680	0.0663404	1.673	0.094787	.
HCrime	-0.0370378	0.0476672	-0.777	0.437390	
HMedicine	-0.0379234	0.0594365	-0.638	0.523629	

EPrivate	-0.0143972	0.0108083	-1.332	0.183234
EGovernment	-0.0060337	0.0093788	-0.643	0.520201
SSecure	0.1847906	0.0382394	4.832	1.62e-06 ***
STOpportunity	-0.0092476	0.0119333	-0.775	0.438610
STFaith	0.0059130	0.0094658	0.625	0.532374
STImportant	-0.0148291	0.0098155	-1.511	0.131249
PNewspaper	-0.0107666	0.0150605	-0.715	0.474891
PTelevision	0.0455606	0.0176405	2.583	0.009984 **
PMobile	0.0252953	0.0193815	1.305	0.192235
PSocial	0.0045400	0.0171476	0.265	0.791266
PDemImp	0.0037765	0.0135832	0.278	0.781065
PDemCurrent	-0.0263736	0.0157606	-1.673	0.094653 .
PSatisfied	-0.0462618	0.0152535	-3.033	0.002503 **
MF	0.0190112	0.0442726	0.429	0.667742
Age	0.0008064	0.0018671	0.432	0.665944
Edu	-0.0097569	0.0145448	-0.671	0.502538
Employment	0.0201444	0.0106751	1.887	0.059526 .

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

Residual standard error: 0.6053 on 778 degrees of freedom

(232 observations deleted due to missingness)

Multiple R-squared: 0.2099, Adjusted R-squared: 0.1804

F-statistic: 7.126 on 29 and 778 DF, p-value: < 2.2e-16

```
summary(CCourts_SGP_fit)
```

Call:

```
lm(formula = CCourts ~ . - CReligious - CTelevision - CPolice -
    CGovernment - CUniversities - CElections - CMajCompanies -
    CBanks - CEnvOrg, data = VC_SGP_numerical_attr)
```

Residuals:

	Min	1Q	Median	3Q	Max
	-1.52800	-0.42435	0.02223	0.34312	2.15355

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	1.7399614	0.4018263	4.330	1.69e-05 ***
TPeople	0.0299560	0.0534778	0.560	0.57553
TFamily	0.0403954	0.0496780	0.813	0.41638

TNeighbourhood	0.0750752	0.0480623	1.562	0.11869
TKnow	0.0681904	0.0472991	1.442	0.14979
TMeet	0.0574817	0.0419092	1.372	0.17059
VFriends	0.0018033	0.0386902	0.047	0.96284
VReligion	0.0158406	0.0242811	0.652	0.51435
HHealth	-0.0381987	0.0324208	-1.178	0.23907
HSatFin	-0.0178041	0.0132536	-1.343	0.17955
HFood	0.1362001	0.0710182	1.918	0.05550 .
HCrime	-0.0164800	0.0510283	-0.323	0.74681
HMedicine	-0.0600394	0.0636275	-0.944	0.34566
EPrivate	-0.0139535	0.0115704	-1.206	0.22820
EGovernment	-0.0105320	0.0100401	-1.049	0.29451
SSecure	0.1015356	0.0409358	2.480	0.01334 *
STOpportunity	-0.0206699	0.0127748	-1.618	0.10606
STFaith	0.0043716	0.0101333	0.431	0.66629
STImportant	0.0070079	0.0105076	0.667	0.50501
PNewspaper	0.0236079	0.0161225	1.464	0.14352
PTelevision	0.0227841	0.0188844	1.207	0.22799
PMobile	0.0180648	0.0207481	0.871	0.38420
PSocial	0.0001796	0.0183567	0.010	0.99220
PDemImp	0.0038995	0.0145410	0.268	0.78864
PDemCurrent	-0.0428799	0.0168719	-2.541	0.01123 *
PSatisfied	-0.0534263	0.0163291	-3.272	0.00112 **
MF	-0.0215798	0.0473943	-0.455	0.64900
Age	0.0027908	0.0019987	1.396	0.16302
Edu	-0.0099307	0.0155704	-0.638	0.52379
Employment	0.0156740	0.0114278	1.372	0.17059

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

Residual standard error: 0.648 on 778 degrees of freedom
(232 observations deleted due to missingness)

Multiple R-squared: 0.1795, Adjusted R-squared: 0.1489

F-statistic: 5.867 on 29 and 778 DF, p-value: < 2.2e-16

```
summary(CGovernment_SGP_fit)
```

Call:

```
lm(formula = CGovernment ~ . - CReligious - CTelevision - CPolice -  
    CCourts - CUniversities - CElections - CMajCompanies - CBanks -  
    CEnvOrg, data = VC_SGP_numerical_attr)
```

Residuals:

Min	1Q	Median	3Q	Max
-1.66035	-0.40029	0.01506	0.35363	2.22190

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)	
(Intercept)	2.073499	0.366466	5.658	2.15e-08	***
TPeople	0.060701	0.048772	1.245	0.21365	
TFamily	0.040506	0.045306	0.894	0.37157	
TNeighbourhood	0.017384	0.043833	0.397	0.69177	
TKnow	0.183767	0.043137	4.260	2.29e-05	***
TMeet	-0.010215	0.038221	-0.267	0.78934	
VFriends	-0.024972	0.035285	-0.708	0.47933	
VReligion	0.013155	0.022144	0.594	0.55264	
HHealth	0.030973	0.029568	1.048	0.29518	
HSatFin	-0.003846	0.012087	-0.318	0.75046	
HFood	0.059406	0.064769	0.917	0.35932	
HCrime	0.019168	0.046538	0.412	0.68054	
HMedicine	-0.064301	0.058028	-1.108	0.26816	
EPrivate	-0.023866	0.010552	-2.262	0.02399	*
EGovernment	-0.025690	0.009157	-2.806	0.00515	**
SSecure	0.196060	0.037333	5.252	1.95e-07	***
STOpportunity	-0.002183	0.011651	-0.187	0.85140	
STFaith	0.005637	0.009242	0.610	0.54204	
STImportant	-0.009164	0.009583	-0.956	0.33922	
PNewspaper	0.009461	0.014704	0.643	0.52015	
PTelevision	0.040166	0.017223	2.332	0.01995	*
PMobile	0.026935	0.018922	1.423	0.15500	
PSocial	-0.006191	0.016741	-0.370	0.71162	
PDemImp	0.033876	0.013261	2.554	0.01082	*
PDemCurrent	-0.048440	0.015387	-3.148	0.00171	**
PSatisfied	-0.099937	0.014892	-6.711	3.73e-11	***
MF	-0.106373	0.043224	-2.461	0.01407	*
Age	-0.002522	0.001823	-1.383	0.16693	
Edu	0.026856	0.014200	1.891	0.05896	.
Employment	0.005756	0.010422	0.552	0.58092	

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

Residual standard error: 0.5909 on 778 degrees of freedom

(232 observations deleted due to missingness)

Multiple R-squared: 0.3514, Adjusted R-squared: 0.3272

F-statistic: 14.54 on 29 and 778 DF, p-value: < 2.2e-16

```
summary(CUniversities_SGP_fit)
```

Call:

```
lm(formula = CUniversities ~ . - CReligious - CTelevision - CPolice -  
    CCourts - CGovernment - CElections - CMajCompanies - CBanks -  
    CEnvOrg, data = VC_SGP_numerical_attr)
```

Residuals:

	Min	1Q	Median	3Q	Max
	-1.42827	-0.33025	-0.00496	0.26483	2.29829

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)	
(Intercept)	1.4174103	0.3628439	3.906	0.000102	***
TPeople	-0.0233759	0.0482897	-0.484	0.628468	
TFamily	0.0866363	0.0448586	1.931	0.053806	.
TNeighbourhood	-0.0275581	0.0433997	-0.635	0.525626	
TKnow	0.1877714	0.0427105	4.396	1.25e-05	***
TMeet	0.0260172	0.0378435	0.687	0.491976	
VFriends	0.0091049	0.0349367	0.261	0.794461	
VReligion	-0.0087521	0.0219255	-0.399	0.689876	
HHealth	0.0195292	0.0292756	0.667	0.504918	
HSatFin	-0.0040864	0.0119678	-0.341	0.732860	
HFood	0.0783382	0.0641285	1.222	0.222236	
HCrime	0.0032629	0.0460779	0.071	0.943565	
HMedicine	-0.0658295	0.0574548	-1.146	0.252246	
EPrivate	-0.0152534	0.0104479	-1.460	0.144709	
EGovernment	-0.0022966	0.0090661	-0.253	0.800092	
SSecure	0.1877700	0.0369645	5.080	4.73e-07	***
STOpportunity	0.0064467	0.0115354	0.559	0.576419	
STFaith	0.0162600	0.0091502	1.777	0.075958	.
STImportant	0.0110089	0.0094882	1.160	0.246296	
PNewspaper	0.0089184	0.0145584	0.613	0.540321	
PTelevision	0.0352056	0.0170523	2.065	0.039295	*
PMobile	0.0168886	0.0187353	0.901	0.367638	
PSocial	-0.0033857	0.0165759	-0.204	0.838207	
PDemImp	-0.0120933	0.0131303	-0.921	0.357323	
PDemCurrent	-0.0198153	0.0152351	-1.301	0.193769	
PSatisfied	-0.0330361	0.0147450	-2.240	0.025340	*

MF	0.0019242	0.0427965	0.045	0.964149
Age	-0.0003091	0.0018048	-0.171	0.864072
Edu	-0.0080698	0.0140599	-0.574	0.566163
Employment	0.0024955	0.0103192	0.242	0.808973

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

Residual standard error: 0.5851 on 778 degrees of freedom

(232 observations deleted due to missingness)

Multiple R-squared: 0.1752, Adjusted R-squared: 0.1445

F-statistic: 5.7 on 29 and 778 DF, p-value: < 2.2e-16

```
summary(CElections_SGP_fit)
```

Call:

```
lm(formula = CElections ~ . - CReligious - CTelevision - CPolice -
    CCourts - CGovernment - CUniversities - CMajCompanies - CBanks -
    CEnvOrg, data = VC_SGP_numerical_attr)
```

Residuals:

	Min	1Q	Median	3Q	Max
	-1.97731	-0.41241	-0.01293	0.42822	1.90467

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)	
(Intercept)	2.629020	0.395108	6.654	5.38e-11	***
TPeople	0.017932	0.052584	0.341	0.733183	
TFamily	0.037370	0.048847	0.765	0.444481	
TNeighbourhood	0.026479	0.047259	0.560	0.575437	
TKnow	0.123120	0.046508	2.647	0.008279	**
TMeet	0.044414	0.041208	1.078	0.281458	
VFriends	-0.069025	0.038043	-1.814	0.070004	.
VReligion	0.025834	0.023875	1.082	0.279568	
HHealth	0.034061	0.031879	1.068	0.285643	
HSatFin	-0.002312	0.013032	-0.177	0.859251	
HFood	0.093395	0.069831	1.337	0.181470	
HCrime	0.009630	0.050175	0.192	0.847848	
HMedicine	-0.115035	0.062564	-1.839	0.066343	.
EPrivate	-0.037581	0.011377	-3.303	0.000999	***
EGovernment	-0.012975	0.009872	-1.314	0.189130	
SSecure	0.175063	0.040251	4.349	1.55e-05	***

STOpportunity	-0.004486	0.012561	-0.357	0.721079
STFaith	-0.012218	0.009964	-1.226	0.220498
STImportant	0.014106	0.010332	1.365	0.172556
PNewspaper	0.026170	0.015853	1.651	0.099181 .
PTelevision	0.012943	0.018569	0.697	0.485973
PMobile	0.010868	0.020401	0.533	0.594387
PSocial	-0.020741	0.018050	-1.149	0.250869
PDemImp	0.001918	0.014298	0.134	0.893312
PDemCurrent	-0.045406	0.016590	-2.737	0.006342 **
PSatisfied	-0.085722	0.016056	-5.339	1.23e-07 ***
MF	-0.042251	0.046602	-0.907	0.364878
Age	-0.001441	0.001965	-0.733	0.463568
Edu	0.013418	0.015310	0.876	0.381068
Employment	-0.001495	0.011237	-0.133	0.894221

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

Residual standard error: 0.6371 on 778 degrees of freedom
(232 observations deleted due to missingness)

Multiple R-squared: 0.2746, Adjusted R-squared: 0.2476

F-statistic: 10.16 on 29 and 778 DF, p-value: < 2.2e-16

```
summary(CMajCompanies_SGP_fit)
```

Call:

```
lm(formula = CMajCompanies ~ . - CReligious - CTelevision - CPolice -  
    CCourts - CGovernment - CUniversities - CElections - CBanks -  
    CEnvOrg, data = VC_SGP_numerical_attr)
```

Residuals:

Min	1Q	Median	3Q	Max
-1.8121	-0.3911	-0.1552	0.5027	1.8076

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	1.611018	0.369086	4.365	1.44e-05 ***
TPeople	-0.022880	0.049120	-0.466	0.64149
TFamily	0.081110	0.045630	1.778	0.07587 .
TNeighbourhood	0.037886	0.044146	0.858	0.39105
TKnow	0.108838	0.043445	2.505	0.01244 *
TMeet	0.052461	0.038495	1.363	0.17333

VFriends	-0.026333	0.035538	-0.741	0.45892
VReligion	0.024289	0.022303	1.089	0.27646
HHealth	0.087024	0.029779	2.922	0.00358 **
HSatFin	-0.004928	0.012174	-0.405	0.68571
HFood	-0.009186	0.065232	-0.141	0.88804
HCrime	0.034491	0.046871	0.736	0.46203
HMedicine	-0.035115	0.058443	-0.601	0.54813
EPrivate	-0.006755	0.010628	-0.636	0.52525
EGovernment	-0.002237	0.009222	-0.243	0.80838
SSecure	0.095570	0.037600	2.542	0.01122 *
STOpportunity	-0.011327	0.011734	-0.965	0.33469
STFaith	-0.006805	0.009308	-0.731	0.46492
STImportant	0.008699	0.009651	0.901	0.36773
PNewspaper	0.025042	0.014809	1.691	0.09124 .
PTelevision	0.011962	0.017346	0.690	0.49062
PMobile	0.029866	0.019058	1.567	0.11749
PSocial	0.005693	0.016861	0.338	0.73571
PDemImp	0.018269	0.013356	1.368	0.17176
PDemCurrent	-0.025519	0.015497	-1.647	0.10002
PSatisfied	-0.032373	0.014999	-2.158	0.03120 *
MF	-0.047020	0.043533	-1.080	0.28043
Age	0.002107	0.001836	1.148	0.25152
Edu	0.039634	0.014302	2.771	0.00572 **
Employment	0.004493	0.010497	0.428	0.66875

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

Residual standard error: 0.5952 on 778 degrees of freedom

(232 observations deleted due to missingness)

Multiple R-squared: 0.1427, Adjusted R-squared: 0.1108

F-statistic: 4.466 on 29 and 778 DF, p-value: 2.388e-13

```
summary(CBanks_SGP_fit)
```

Call:

```
lm(formula = CBanks ~ . - CReligious - CTelevision - CPolice -
    CCourts - CGovernment - CUniversities - CElections - CMajCompanies -
    CEnvOrg, data = VC_SGP_numerical_attr)
```

Residuals:

Min	1Q	Median	3Q	Max
-----	----	--------	----	-----

-1.76677 -0.31612 -0.02818 0.30708 2.08978

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)	
(Intercept)	1.476893	0.384385	3.842	0.000132	***
TPeople	-0.018600	0.051157	-0.364	0.716262	
TFamily	0.096166	0.047522	2.024	0.043351	*
TNeighbourhood	0.061915	0.045976	1.347	0.178475	
TKnow	0.174767	0.045246	3.863	0.000122	***
TMeet	-0.025535	0.040090	-0.637	0.524358	
VFriends	-0.054455	0.037011	-1.471	0.141610	
VReligion	0.057121	0.023227	2.459	0.014140	*
HHealth	0.065265	0.031014	2.104	0.035664	*
HSatFin	-0.010168	0.012678	-0.802	0.422792	
HFood	0.142642	0.067936	2.100	0.036081	*
HCrime	-0.045858	0.048813	-0.939	0.347790	
HMedicine	-0.093655	0.060866	-1.539	0.124279	
EPrivate	-0.011659	0.011068	-1.053	0.292496	
EGovernment	-0.001032	0.009604	-0.107	0.914458	
SSecure	0.142004	0.039159	3.626	0.000306	***
STOpportunity	-0.008498	0.012220	-0.695	0.487008	
STFaith	-0.002442	0.009693	-0.252	0.801200	
STImportant	0.010988	0.010052	1.093	0.274678	
PNewspaper	0.020737	0.015423	1.345	0.179152	
PTelevision	0.017806	0.018065	0.986	0.324585	
PMobile	-0.010195	0.019848	-0.514	0.607639	
PSocial	0.012018	0.017560	0.684	0.493928	
PDemImp	0.021690	0.013910	1.559	0.119324	
PDemCurrent	-0.042536	0.016140	-2.636	0.008568	**
PSatisfied	-0.012286	0.015620	-0.787	0.431802	
MF	-0.006437	0.045337	-0.142	0.887140	
Age	-0.002502	0.001912	-1.309	0.191000	
Edu	0.020179	0.014895	1.355	0.175868	
Employment	0.001246	0.010932	0.114	0.909248	

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

Residual standard error: 0.6198 on 778 degrees of freedom

(232 observations deleted due to missingness)

Multiple R-squared: 0.1772, Adjusted R-squared: 0.1465

F-statistic: 5.776 on 29 and 778 DF, p-value: < 2.2e-16

```
summary(CEnvOrg_SGP_fit)
```

Call:

```
lm(formula = CEnvOrg ~ . - CReligious - CTelevision - CPolice -  
    CCourts - CGovernment - CUniversities - CElections - CMajCompanies -  
    CBanks, data = VC_SGP_numerical_attr)
```

Residuals:

Min	1Q	Median	3Q	Max
-1.60443	-0.30870	-0.08679	0.35766	2.11010

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)	
(Intercept)	1.875203	0.373148	5.025	6.24e-07	***
TPeople	-0.056221	0.049661	-1.132	0.25794	
TFamily	0.094909	0.046132	2.057	0.03999	*
TNeighbourhood	0.024040	0.044632	0.539	0.59030	
TKnow	0.164717	0.043923	3.750	0.00019	***
TMeet	0.029157	0.038918	0.749	0.45398	
VFriends	0.013456	0.035929	0.375	0.70812	
VReligion	-0.009758	0.022548	-0.433	0.66529	
HHealth	-0.000625	0.030107	-0.021	0.98344	
HSatFin	-0.015759	0.012308	-1.280	0.20079	
HFood	0.041023	0.065950	0.622	0.53410	
HCrime	0.001619	0.047386	0.034	0.97276	
HMedicine	-0.036042	0.059086	-0.610	0.54205	
EPrivate	-0.011166	0.010745	-1.039	0.29904	
EGovernment	0.005554	0.009324	0.596	0.55154	
SSecure	0.134413	0.038014	3.536	0.00043	***
STOpportunity	-0.021429	0.011863	-1.806	0.07125	.
STFaith	0.002789	0.009410	0.296	0.76699	
STImportant	0.003439	0.009758	0.352	0.72462	
PNewspaper	-0.004104	0.014972	-0.274	0.78406	
PTelevision	0.036016	0.017537	2.054	0.04033	*
PMobile	0.001863	0.019267	0.097	0.92298	
PSocial	-0.015451	0.017047	-0.906	0.36499	
PDemImp	-0.017764	0.013503	-1.316	0.18871	
PDemCurrent	-0.018884	0.015668	-1.205	0.22845	
PSatisfied	-0.029799	0.015164	-1.965	0.04975	*
MF	-0.064279	0.044012	-1.461	0.14456	
Age	0.003640	0.001856	1.961	0.05022	.

Edu	0.036799	0.014459	2.545	0.01112 *
Employment	0.012971	0.010612	1.222	0.22197

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

Residual standard error: 0.6017 on 778 degrees of freedom

(232 observations deleted due to missingness)

Multiple R-squared: 0.1497, Adjusted R-squared: 0.118

F-statistic: 4.721 on 29 and 778 DF, p-value: 1.901e-14

Extracting all p-values from each linear regression and sorting them to get the top-10 sma

```
p_values_CReligious_SGP = summary(CReligious_SGP_fit)$coefficients[2:30, "Pr(>|t|)"]
```

```
top_10_sorted_p_values_CReligious_SGP = head(sort(p_values_CReligious_SGP), 10)
```

```
p_values_CTelevision_SGP = summary(CTelevision_SGP_fit)$coefficients[2:30, "Pr(>|t|)"]
```

```
top_10_sorted_p_values_CTelevision_SGP = head(sort(p_values_CTelevision_SGP), 10)
```

```
p_values_CPolice_SGP = summary(CPolice_SGP_fit)$coefficients[2:30, "Pr(>|t|)"]
```

```
top_10_sorted_p_values_CPolice_SGP = head(sort(p_values_CPolice_SGP), 10)
```

```
p_values_CCourts_SGP = summary(CCourts_SGP_fit)$coefficients[2:30, "Pr(>|t|)"]
```

```
top_10_sorted_p_values_CCourts_SGP = head(sort(p_values_CCourts_SGP), 10)
```

```
p_values_CGovernment_SGP = summary(CGovernment_SGP_fit)$coefficients[2:30, "Pr(>|t|)"]
```

```
top_10_sorted_p_values_CGovernment_SGP = head(sort(p_values_CGovernment_SGP), 10)
```

```
p_values_CUniversities_SGP = summary(CUniversities_SGP_fit)$coefficients[2:30, "Pr(>|t|)"]
```

```
top_10_sorted_p_values_CUniversities_SGP = head(sort(p_values_CUniversities_SGP), 10)
```

```
p_values_CElections_SGP = summary(CElections_SGP_fit)$coefficients[2:30, "Pr(>|t|)"]
```

```
top_10_sorted_p_values_CElections_SGP = head(sort(p_values_CElections_SGP), 10)
```

```
p_values_CMajCompanies_SGP = summary(CMajCompanies_SGP_fit)$coefficients[2:30, "Pr(>|t|)"]
```

```
top_10_sorted_p_values_CMajCompanies_SGP = head(sort(p_values_CMajCompanies_SGP), 10)
```

```

p_values_CBanks_SGP = summary(CBanks_SGP_fit)$coefficients[2:30, "Pr(>|t|)"]
top_10_sorted_p_values_CBanks_SGP = head(sort(p_values_CBanks_SGP), 10)

p_values_CEnvOrg_SGP = summary(CEnvOrg_SGP_fit)$coefficients[2:30, "Pr(>|t|)"]
top_10_sorted_p_values_CEnvOrg_SGP = head(sort(p_values_CEnvOrg_SGP), 10)

# Plotting barcharts of the top-10 smallest p-values predictors for each confidence in social
par(mar=c(8, 4, 2, 2), mfrow = c(2,5))

barplot(top_10_sorted_p_values_CReligious_SGP,
        main = "CReligious for SGP",
        ylab = "P-values",
        col = "purple",
        las = 2)

barplot(top_10_sorted_p_values_CTelevision_SGP,
        main = "CTelevision for SGP",
        ylab = "P-values",
        col = "purple",
        las = 2)

barplot(top_10_sorted_p_values_CPolice_SGP,
        main = "CPolice for SGP",
        ylab = "P-values",
        col = "purple",
        las = 2)

barplot(top_10_sorted_p_values_CCourts_SGP,
        main = "CCourts for SGP",
        ylab = "P-values",
        col = "purple",
        las = 2)

barplot(top_10_sorted_p_values_CGovernment_SGP,
        main = "CGovernment for SGP",
        ylab = "P-values",
        col = "purple",
        las = 2)

barplot(top_10_sorted_p_values_CUniversities_SGP,

```

```

    main = "CUniversities for SGP",
    ylab = "P-values",
    col = "purple",
    las = 2)

barplot(top_10_sorted_p_values_CElections_SGP,
    main = "CElections for SGP",
    ylab = "P-values",
    col = "purple",
    las = 2)

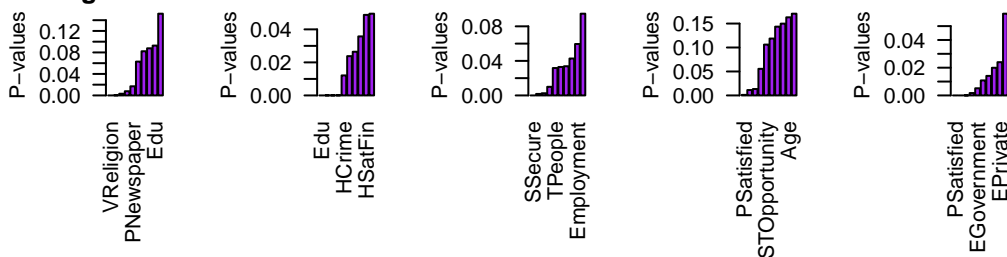
barplot(top_10_sorted_p_values_CMajCompanies_SGP,
    main = "CMajCompanies for SGP",
    ylab = "P-values",
    col = "purple",
    las = 2)

barplot(top_10_sorted_p_values_CBanks_SGP,
    main = "CBanks for SGP",
    ylab = "P-values",
    col = "purple",
    las = 2)

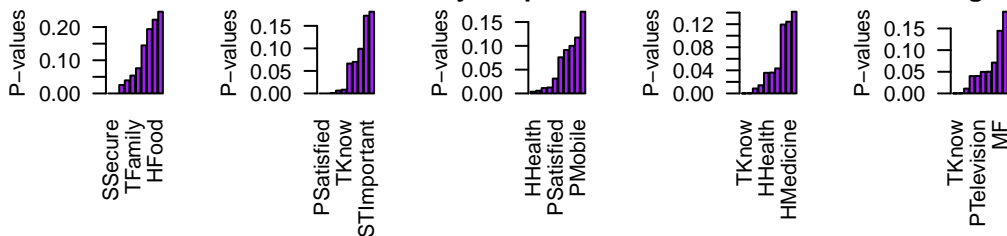
barplot(top_10_sorted_p_values_CEnvOrg_SGP,
    main = "CEnvOrg for SGP",
    ylab = "P-values",
    col = "purple",
    las = 2)

```

CReligious for SCTelevision for SCPolice for SGCourts for SCGovernment for



CUniversities for CElections for SMajCompanies for CBanks for SCEnvOrg for SC



```
par(mfrow = c(1,1))
```

Question 2c code

```
VC_other_numerical_attr = VC_other_countries[, 2:40]

# Fitting linear regression for each confidence in social organisations in VC non-focus countries
CReligious_other_fit = lm(CReligious ~.-CTelevision-CPolice-CCourts-CGovernment-CUniversities-CElections)
CTelevision_other_fit = lm(CTelevision ~.-CReligious-CPolice-CCourts-CGovernment-CUniversities-CElections)
CPolice_other_fit = lm(CPolice ~.-CReligious-CTelevision-CCourts-CGovernment-CUniversities-CElections)
CCourts_other_fit = lm(CCourts ~.-CReligious-CTelevision-CPolice-CGovernment-CUniversities-CElections)
CGovernment_other_fit = lm(CGovernment ~.-CReligious-CTelevision-CPolice-CCourts-CUniversities-CElections)
CUniversities_other_fit = lm(CUniversities ~.-CReligious-CTelevision-CPolice-CCourts-CGovernment-CElections)
CElections_other_fit = lm(CElections ~.-CReligious-CTelevision-CPolice-CCourts-CGovernment-CUniversities)
```

```
CMajCompanies_other_fit = lm(CMajCompanies ~.-CReligious-CTelevision-CPolice-CCourts-CGovernment-
CBanks_other_fit = lm(CBanks ~.-CReligious-CTelevision-CPolice-CCourts-CGovernment-CUniversities-
CEnvOrg_other_fit = lm(CEnvOrg ~.-CReligious-CTelevision-CPolice-CCourts-CGovernment-CUniversities-
# Analysing the linear regression fitted for each confidence in social organisation in VC non
summary(CReligious_other_fit)
```

Call:

```
lm(formula = CReligious ~ . - CTelevision - CPolice - CCourts -
    CGovernment - CUniversities - CElections - CMajCompanies -
    CBanks - CEnvOrg, data = VC_other_numerical_attr)
```

Residuals:

	Min	1Q	Median	3Q	Max
	-2.71429	-0.60886	-0.08781	0.50690	2.94739

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	0.5561408	0.0524597	10.601	< 2e-16 ***
TPeople	0.0171489	0.0111851	1.533	0.12524
TFamily	0.1237942	0.0081578	15.175	< 2e-16 ***
TNeighbourhood	0.1018902	0.0066072	15.421	< 2e-16 ***
TKnow	0.0030748	0.0065380	0.470	0.63815
TMeet	0.0280846	0.0062018	4.528	5.96e-06 ***
VFriends	-0.0197163	0.0061157	-3.224	0.00127 **
VReligion	0.4673292	0.0043117	108.388	< 2e-16 ***
HHealth	0.0172491	0.0054028	3.193	0.00141 **
HSatFin	-0.0132314	0.0019723	-6.709	1.99e-11 ***
HFood	0.0461411	0.0062529	7.379	1.63e-13 ***
HCrime	-0.0172498	0.0056933	-3.030	0.00245 **
HMedicine	0.0309182	0.0056804	5.443	5.27e-08 ***
EPrivate	-0.0008943	0.0015349	-0.583	0.56014
EGovernment	-0.0004735	0.0014516	-0.326	0.74426
SSecure	0.0479548	0.0057609	8.324	< 2e-16 ***
STOpportunity	-0.0083218	0.0019165	-4.342	1.42e-05 ***
STFaith	-0.0014516	0.0015253	-0.952	0.34129
STImportant	-0.0080253	0.0015334	-5.234	1.67e-07 ***
PNewspaper	0.0153905	0.0029332	5.247	1.56e-07 ***
PTelevision	0.0421937	0.0035812	11.782	< 2e-16 ***

PMobile	0.0074253	0.0031154	2.383	0.01716	*
PSocial	-0.0364227	0.0030887	-11.792	< 2e-16	***
PDemImp	0.0040519	0.0021226	1.909	0.05628	.
PDemCurrent	-0.0141477	0.0021208	-6.671	2.58e-11	***
PSatisfied	-0.0160107	0.0020236	-7.912	2.61e-15	***
MF	-0.0338476	0.0087507	-3.868	0.00011	***
Age	0.0034722	0.0003125	11.112	< 2e-16	***
Edu	0.0283290	0.0023776	11.915	< 2e-16	***
Employment	-0.0056359	0.0021471	-2.625	0.00867	**

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

Residual standard error: 0.8077 on 35570 degrees of freedom

(13360 observations deleted due to missingness)

Multiple R-squared: 0.3441, Adjusted R-squared: 0.3436

F-statistic: 643.5 on 29 and 35570 DF, p-value: < 2.2e-16

```
summary(CTelevision_other_fit)
```

Call:

```
lm(formula = CTelevision ~ . - CReligious - CPolice - CCourts -
    CGovernment - CUniversities - CElections - CMajCompanies -
    CBanks - CEnvOrg, data = VC_other_numerical_attr)
```

Residuals:

	Min	1Q	Median	3Q	Max
	-2.60217	-0.54341	0.03782	0.54462	2.57736

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)	
(Intercept)	1.5046837	0.0522988	28.771	< 2e-16	***
TPeople	0.0676980	0.0111507	6.071	1.28e-09	***
TFamily	0.0641241	0.0081327	7.885	3.24e-15	***
TNeighbourhood	0.1221512	0.0065869	18.544	< 2e-16	***
TKnow	0.0302623	0.0065179	4.643	3.45e-06	***
TMeet	0.0626795	0.0061828	10.138	< 2e-16	***
VFriends	-0.0159080	0.0060969	-2.609	0.00908	**
VReligion	0.0447229	0.0042984	10.404	< 2e-16	***
HHealth	0.0049710	0.0053862	0.923	0.35606	
HSatFin	0.0029893	0.0019662	1.520	0.12843	
HFood	0.0426390	0.0062337	6.840	8.04e-12	***

HCrime	0.0042123	0.0056758	0.742	0.45801	
HMedicine	0.0046643	0.0056629	0.824	0.41014	
EPrivate	-0.0041960	0.0015302	-2.742	0.00611	**
EGovernment	0.0057824	0.0014471	3.996	6.46e-05	***
SSecure	0.0680604	0.0057432	11.851	< 2e-16	***
STOpportunity	-0.0179603	0.0019107	-9.400	< 2e-16	***
STFaith	0.0013800	0.0015207	0.907	0.36416	
STImportant	-0.0003447	0.0015286	-0.225	0.82160	
PNewspaper	0.0204231	0.0029242	6.984	2.92e-12	***
PTelevision	0.0957337	0.0035703	26.814	< 2e-16	***
PMobile	0.0090396	0.0031058	2.911	0.00361	**
PSocial	-0.0259919	0.0030792	-8.441	< 2e-16	***
PDemImp	0.0155577	0.0021161	7.352	1.99e-13	***
PDemCurrent	-0.0207410	0.0021143	-9.810	< 2e-16	***
PSatisfied	-0.0492408	0.0020174	-24.408	< 2e-16	***
MF	-0.0512603	0.0087238	-5.876	4.24e-09	***
Age	0.0028570	0.0003115	9.171	< 2e-16	***
Edu	0.0387554	0.0023703	16.351	< 2e-16	***
Employment	-0.0061919	0.0021405	-2.893	0.00382	**

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

Residual standard error: 0.8052 on 35570 degrees of freedom

(13360 observations deleted due to missingness)

Multiple R-squared: 0.1466, Adjusted R-squared: 0.1459

F-statistic: 210.8 on 29 and 35570 DF, p-value: < 2.2e-16

```
summary(CPolice_other_fit)
```

Call:

```
lm(formula = CPolice ~ . - CReligious - CTelevision - CCourts -
    CGovernment - CUniversities - CElections - CMajCompanies -
    CBanks - CEnvOrg, data = VC_other_numerical_attr)
```

Residuals:

Min	1Q	Median	3Q	Max
-2.55793	-0.58717	-0.04983	0.59605	2.57760

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	1.646e+00	5.523e-02	29.805	< 2e-16 ***

TPeople	1.148e-01	1.178e-02	9.752	< 2e-16	***
TFamily	1.204e-01	8.589e-03	14.014	< 2e-16	***
TNeighbourhood	1.062e-01	6.956e-03	15.260	< 2e-16	***
TKnow	7.966e-02	6.883e-03	11.573	< 2e-16	***
TMeet	3.710e-02	6.529e-03	5.682	1.34e-08	***
VFriends	3.452e-02	6.439e-03	5.361	8.32e-08	***
VReligion	2.654e-02	4.539e-03	5.847	5.05e-09	***
HHealth	1.888e-02	5.688e-03	3.320	0.000902	***
HSatFin	-6.751e-05	2.076e-03	-0.033	0.974062	
HFood	-1.165e-02	6.583e-03	-1.770	0.076758	.
HCrime	-1.527e-02	5.994e-03	-2.547	0.010873	*
HMedicine	-2.529e-02	5.980e-03	-4.228	2.36e-05	***
EPrivate	3.269e-03	1.616e-03	2.023	0.043070	*
EGovernment	-2.277e-03	1.528e-03	-1.490	0.136293	
SSecure	1.362e-01	6.065e-03	22.448	< 2e-16	***
STOpportunity	-5.854e-03	2.018e-03	-2.901	0.003722	**
STFaith	8.294e-03	1.606e-03	5.164	2.43e-07	***
STImportant	1.050e-02	1.614e-03	6.501	8.07e-11	***
PNewspaper	2.102e-03	3.088e-03	0.681	0.496030	
PTelevision	1.889e-02	3.770e-03	5.010	5.46e-07	***
PMobile	8.036e-03	3.280e-03	2.450	0.014287	*
PSocial	1.300e-02	3.252e-03	3.999	6.38e-05	***
PDemImp	8.031e-03	2.235e-03	3.594	0.000327	***
PDemCurrent	-3.871e-02	2.233e-03	-17.335	< 2e-16	***
PSatisfied	-4.479e-02	2.131e-03	-21.024	< 2e-16	***
MF	-5.548e-02	9.213e-03	-6.022	1.74e-09	***
Age	-3.466e-03	3.290e-04	-10.535	< 2e-16	***
Edu	2.302e-02	2.503e-03	9.198	< 2e-16	***
Employment	-2.928e-03	2.260e-03	-1.295	0.195272	

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

Residual standard error: 0.8504 on 35570 degrees of freedom

(13360 observations deleted due to missingness)

Multiple R-squared: 0.1716, Adjusted R-squared: 0.171

F-statistic: 254.1 on 29 and 35570 DF, p-value: < 2.2e-16

```
summary(CCourts_other_fit)
```

Call:

```
lm(formula = CCourts ~ . - CReligious - CTelevision - CPolice -
```

CGovernment - CUniversities - CElections - CMajCompanies -
CBanks - CEnvOrg, data = VC_other_numerical_attr)

Residuals:

	Min	1Q	Median	3Q	Max
	-2.69584	-0.57861	-0.03781	0.59192	2.75975

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)	
(Intercept)	1.3728411	0.0548519	25.028	< 2e-16	***
TPeople	0.1392410	0.0116951	11.906	< 2e-16	***
TFamily	0.0927093	0.0085297	10.869	< 2e-16	***
TNeighbourhood	0.1148264	0.0069085	16.621	< 2e-16	***
TKnow	0.0773833	0.0068361	11.320	< 2e-16	***
TMeet	0.0394449	0.0064846	6.083	1.19e-09	***
VFriends	0.0212336	0.0063945	3.321	0.000899	***
VReligion	0.0165782	0.0045083	3.677	0.000236	***
HHealth	0.0213253	0.0056491	3.775	0.000160	***
HSatFin	-0.0013827	0.0020622	-0.670	0.502544	
HFood	0.0165763	0.0065380	2.535	0.011237	*
HCrime	-0.0333183	0.0059529	-5.597	2.20e-08	***
HMedicine	-0.0050401	0.0059394	-0.849	0.396113	
EPrivate	-0.0003454	0.0016049	-0.215	0.829605	
EGovernment	0.0082489	0.0015178	5.435	5.52e-08	***
SSecure	0.1278575	0.0060236	21.226	< 2e-16	***
STOpportunity	-0.0111183	0.0020039	-5.548	2.91e-08	***
STFaith	0.0197892	0.0015949	12.408	< 2e-16	***
STImportant	0.0120721	0.0016033	7.530	5.21e-14	***
PNewspaper	0.0100627	0.0030670	3.281	0.001035	**
PTelevision	0.0314949	0.0037445	8.411	< 2e-16	***
PMobile	0.0178061	0.0032574	5.466	4.63e-08	***
PSocial	-0.0113270	0.0032295	-3.507	0.000453	***
PDemImp	0.0058024	0.0022194	2.614	0.008941	**
PDemCurrent	-0.0359951	0.0022175	-16.232	< 2e-16	***
PSatisfied	-0.0567950	0.0021159	-26.842	< 2e-16	***
MF	-0.0418228	0.0091497	-4.571	4.87e-06	***
Age	0.0017942	0.0003267	5.491	4.01e-08	***
Edu	0.0256788	0.0024860	10.329	< 2e-16	***
Employment	-0.0004663	0.0022450	-0.208	0.835470	

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

Residual standard error: 0.8446 on 35570 degrees of freedom

(13360 observations deleted due to missingness)
Multiple R-squared: 0.1841, Adjusted R-squared: 0.1835
F-statistic: 276.8 on 29 and 35570 DF, p-value: < 2.2e-16

```
summary(CGovernment_other_fit)
```

Call:

```
lm(formula = CGovernment ~ . - CReligious - CTelevision - CPolice -  
    CCourts - CUniversities - CElections - CMajCompanies - CBanks -  
    CEnvOrg, data = VC_other_numerical_attr)
```

Residuals:

	Min	1Q	Median	3Q	Max
	-2.94619	-0.57916	0.00072	0.59837	2.84486

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	2.0769898	0.0546755	37.988	< 2e-16 ***
TPeople	0.1089215	0.0116575	9.343	< 2e-16 ***
TFamily	0.0826815	0.0085023	9.725	< 2e-16 ***
TNeighbourhood	0.1183673	0.0068863	17.189	< 2e-16 ***
TKnow	0.0154566	0.0068141	2.268	0.023317 *
TMeet	0.0306814	0.0064638	4.747	2.08e-06 ***
VFriends	-0.0065417	0.0063740	-1.026	0.304754
VReligion	0.0490262	0.0044938	10.910	< 2e-16 ***
HHealth	0.0082495	0.0056310	1.465	0.142925
HSatFin	-0.0015148	0.0020556	-0.737	0.461182
HFood	0.0417957	0.0065170	6.413	1.44e-10 ***
HCrime	-0.0391623	0.0059338	-6.600	4.17e-11 ***
HMedicine	0.0125777	0.0059203	2.125	0.033634 *
EPrivate	-0.0024195	0.0015998	-1.512	0.130441
EGovernment	-0.0009958	0.0015129	-0.658	0.510411
SSecure	0.1086090	0.0060042	18.089	< 2e-16 ***
STOpportunity	-0.0169355	0.0019975	-8.478	< 2e-16 ***
STFaith	0.0075850	0.0015898	4.771	1.84e-06 ***
STImportant	0.0161728	0.0015981	10.120	< 2e-16 ***
PNewspaper	0.0068290	0.0030571	2.234	0.025503 *
PTelevision	0.0267479	0.0037325	7.166	7.86e-13 ***
PMobile	0.0165187	0.0032470	5.087	3.65e-07 ***
PSocial	-0.0289598	0.0032191	-8.996	< 2e-16 ***
PDemImp	0.0157240	0.0022122	7.108	1.20e-12 ***

PDemCurrent	-0.0444123	0.0022104	-20.093	< 2e-16	***
PSatisfied	-0.1157383	0.0021091	-54.875	< 2e-16	***
MF	-0.0340929	0.0091203	-3.738	0.000186	***
Age	0.0024275	0.0003257	7.454	9.28e-14	***
Edu	0.0445708	0.0024780	17.987	< 2e-16	***
Employment	0.0069348	0.0022378	3.099	0.001943	**

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

Residual standard error: 0.8418 on 35570 degrees of freedom

(13360 observations deleted due to missingness)

Multiple R-squared: 0.2712, Adjusted R-squared: 0.2706

F-statistic: 456.5 on 29 and 35570 DF, p-value: < 2.2e-16

```
summary(CUniversities_other_fit)
```

Call:

```
lm(formula = CUniversities ~ . - CReligious - CTelevision - CPolice -
    CCourts - CGovernment - CElections - CMajCompanies - CBanks -
    CEnvOrg, data = VC_other_numerical_attr)
```

Residuals:

	Min	1Q	Median	3Q	Max
	-2.18214	-0.50268	-0.06066	0.53775	2.66724

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	1.6671054	0.0518493	32.153	< 2e-16 ***
TPeople	0.0429404	0.0110549	3.884	0.000103 ***
TFamily	0.0834709	0.0080628	10.353	< 2e-16 ***
TNeighbourhood	0.0610990	0.0065303	9.356	< 2e-16 ***
TKnow	0.0945247	0.0064619	14.628	< 2e-16 ***
TMeet	0.0076930	0.0061297	1.255	0.209470
VFriends	0.0130047	0.0060445	2.151	0.031444 *
VReligion	0.0230117	0.0042615	5.400	6.71e-08 ***
HHealth	0.0255826	0.0053399	4.791	1.67e-06 ***
HSatFin	-0.0138592	0.0019493	-7.110	1.18e-12 ***
HFood	-0.0017250	0.0061801	-0.279	0.780148
HCrime	0.0171095	0.0056270	3.041	0.002363 **
HMedicine	-0.0006221	0.0056143	-0.111	0.911772
EPrivate	-0.0064228	0.0015171	-4.234	2.30e-05 ***

EGovernment	0.0115790	0.0014347	8.071	7.21e-16	***
SSecure	0.0656119	0.0056939	11.523	< 2e-16	***
STOpportunity	-0.0250402	0.0018942	-13.219	< 2e-16	***
STFaith	0.0071101	0.0015076	4.716	2.41e-06	***
STImportant	0.0080490	0.0015155	5.311	1.10e-07	***
PNewspaper	0.0254699	0.0028991	8.785	< 2e-16	***
PTelevision	0.0287544	0.0035396	8.124	4.67e-16	***
PMobile	0.0231846	0.0030791	7.530	5.21e-14	***
PSocial	-0.0183787	0.0030527	-6.020	1.76e-09	***
PDemImp	-0.0221842	0.0020979	-10.575	< 2e-16	***
PDemCurrent	-0.0182905	0.0020961	-8.726	< 2e-16	***
PSatisfied	-0.0224158	0.0020001	-11.207	< 2e-16	***
MF	-0.0161978	0.0086488	-1.873	0.061100	.
Age	0.0011388	0.0003088	3.687	0.000227	***
Edu	0.0199034	0.0023499	8.470	< 2e-16	***
Employment	-0.0070291	0.0021221	-3.312	0.000926	***

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

Residual standard error: 0.7983 on 35570 degrees of freedom

(13360 observations deleted due to missingness)

Multiple R-squared: 0.1006, Adjusted R-squared: 0.09986

F-statistic: 137.2 on 29 and 35570 DF, p-value: < 2.2e-16

```
summary(CElections_other_fit)
```

Call:

```
lm(formula = CElections ~ . - CReligious - CTelevision - CPolice -
    CCourts - CGovernment - CUniversities - CMajCompanies - CBanks -
    CEnvOrg, data = VC_other_numerical_attr)
```

Residuals:

Min	1Q	Median	3Q	Max
-2.72167	-0.57035	-0.00105	0.60427	2.76085

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	2.2081103	0.0546567	40.400	< 2e-16 ***
TPeople	0.1114644	0.0116535	9.565	< 2e-16 ***
TFamily	0.0263174	0.0084994	3.096	0.001960 **
TNeighbourhood	0.0928127	0.0068839	13.483	< 2e-16 ***

TKnow	0.0437526	0.0068118	6.423	1.35e-10	***
TMeet	0.0855379	0.0064615	13.238	< 2e-16	***
VFriends	0.0017699	0.0063718	0.278	0.781192	
VReligion	0.0193639	0.0044922	4.311	1.63e-05	***
HHealth	0.0306605	0.0056290	5.447	5.16e-08	***
HSatFin	-0.0032067	0.0020549	-1.561	0.118636	
HFood	0.0151755	0.0065147	2.329	0.019843	*
HCrime	-0.0321697	0.0059317	-5.423	5.89e-08	***
HMedicine	-0.0019342	0.0059182	-0.327	0.743809	
EPrivate	-0.0034191	0.0015992	-2.138	0.032527	*
EGovernment	0.0070286	0.0015124	4.647	3.37e-06	***
SSecure	0.0896873	0.0060022	14.942	< 2e-16	***
STOpportunity	-0.0103088	0.0019968	-5.163	2.45e-07	***
STFaith	0.0153139	0.0015892	9.636	< 2e-16	***
STImportant	0.0078313	0.0015976	4.902	9.53e-07	***
PNewspaper	0.0292250	0.0030561	9.563	< 2e-16	***
PTelevision	0.0239287	0.0037312	6.413	1.44e-10	***
PMobile	0.0119644	0.0032458	3.686	0.000228	***
PSocial	-0.0359829	0.0032180	-11.182	< 2e-16	***
PDemImp	-0.0059757	0.0022115	-2.702	0.006893	**
PDemCurrent	-0.0487275	0.0022096	-22.052	< 2e-16	***
PSatisfied	-0.0765904	0.0021084	-36.326	< 2e-16	***
MF	0.0022487	0.0091171	0.247	0.805184	
Age	-0.0003864	0.0003256	-1.187	0.235274	
Edu	0.0105590	0.0024772	4.263	2.03e-05	***
Employment	-0.0019530	0.0022370	-0.873	0.382636	

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

Residual standard error: 0.8415 on 35570 degrees of freedom

(13360 observations deleted due to missingness)

Multiple R-squared: 0.2127, Adjusted R-squared: 0.212

F-statistic: 331.3 on 29 and 35570 DF, p-value: < 2.2e-16

```
summary(CMajCompanies_other_fit)
```

Call:

```
lm(formula = CMajCompanies ~ . - CReligious - CTelevision - CPolice -
    CCourts - CGovernment - CUniversities - CElections - CBanks -
    CEnvOrg, data = VC_other_numerical_attr)
```

Residuals:

Min	1Q	Median	3Q	Max
-2.43554	-0.56858	0.06114	0.52276	2.34823

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)	
(Intercept)	1.711525	0.052206	32.784	< 2e-16	***
TPeople	0.038939	0.011131	3.498	0.000469	***
TFamily	0.053852	0.008118	6.633	3.33e-11	***
TNeighbourhood	0.068501	0.006575	10.418	< 2e-16	***
TKnow	0.056417	0.006506	8.671	< 2e-16	***
TMeet	0.081984	0.006172	13.284	< 2e-16	***
VFriends	-0.002249	0.006086	-0.369	0.711769	
VReligion	0.038230	0.004291	8.910	< 2e-16	***
HHealth	0.032279	0.005377	6.004	1.95e-09	***
HSatFin	-0.009227	0.001963	-4.701	2.60e-06	***
HFood	0.028876	0.006223	4.641	3.49e-06	***
HCrime	0.009156	0.005666	1.616	0.106114	
HMedicine	-0.016786	0.005653	-2.969	0.002985	**
EPrivate	0.005518	0.001527	3.613	0.000304	***
EGovernment	-0.003297	0.001445	-2.282	0.022488	*
SSecure	0.056476	0.005733	9.851	< 2e-16	***
STOpportunity	-0.013662	0.001907	-7.163	8.03e-13	***
STFaith	-0.004126	0.001518	-2.718	0.006574	**
STImportant	0.005392	0.001526	3.534	0.000410	***
PNewspaper	0.016170	0.002919	5.540	3.05e-08	***
PTelevision	0.024448	0.003564	6.860	7.00e-12	***
PMobile	0.015203	0.003100	4.904	9.45e-07	***
PSocial	-0.009851	0.003074	-3.205	0.001352	**
PDemImp	0.002148	0.002112	1.017	0.309111	
PDemCurrent	-0.015012	0.002110	-7.113	1.16e-12	***
PSatisfied	-0.035392	0.002014	-17.574	< 2e-16	***
MF	-0.004332	0.008708	-0.497	0.618842	
Age	0.002249	0.000311	7.232	4.87e-13	***
Edu	0.029056	0.002366	12.280	< 2e-16	***
Employment	0.001980	0.002137	0.927	0.354025	

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

Residual standard error: 0.8038 on 35570 degrees of freedom

(13360 observations deleted due to missingness)

Multiple R-squared: 0.09208, Adjusted R-squared: 0.09134

F-statistic: 124.4 on 29 and 35570 DF, p-value: < 2.2e-16

```
summary(CBanks_other_fit)
```

Call:

```
lm(formula = CBanks ~ . - CReligious - CTelevision - CPolice -  
    CCourts - CGovernment - CUniversities - CElections - CMajCompanies -  
    CEnvOrg, data = VC_other_numerical_attr)
```

Residuals:

Min	1Q	Median	3Q	Max
-2.5768	-0.5791	-0.1193	0.6230	2.6402

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)	
(Intercept)	1.6406329	0.0564506	29.063	< 2e-16	***
TPeople	0.0603858	0.0120360	5.017	5.27e-07	***
TFamily	0.0505431	0.0087783	5.758	8.60e-09	***
TNeighbourhood	0.0780554	0.0071098	10.978	< 2e-16	***
TKnow	0.0739928	0.0070354	10.517	< 2e-16	***
TMeet	0.0348206	0.0066736	5.218	1.82e-07	***
VFriends	-0.0071577	0.0065809	-1.088	0.27676	
VReligion	0.0561514	0.0046397	12.102	< 2e-16	***
HHealth	0.0250501	0.0058138	4.309	1.65e-05	***
HSatFin	-0.0176325	0.0021223	-8.308	< 2e-16	***
HFood	0.0348458	0.0067286	5.179	2.25e-07	***
HCrime	-0.0378018	0.0061264	-6.170	6.89e-10	***
HMedicine	-0.0056176	0.0061125	-0.919	0.35808	
EPrivate	-0.0011290	0.0016517	-0.684	0.49426	
EGovernment	-0.0040151	0.0015620	-2.570	0.01016	*
SSecure	0.0725229	0.0061992	11.699	< 2e-16	***
STOpportunity	-0.0150135	0.0020623	-7.280	3.41e-13	***
STFaith	0.0015037	0.0016414	0.916	0.35961	
STImportant	0.0066633	0.0016500	4.038	5.39e-05	***
PNewspaper	0.0087026	0.0031564	2.757	0.00583	**
PTelevision	0.0347937	0.0038537	9.029	< 2e-16	***
PMobile	0.0281424	0.0033524	8.395	< 2e-16	***
PSocial	-0.0181518	0.0033236	-5.461	4.75e-08	***
PDemImp	0.0050787	0.0022841	2.224	0.02619	*
PDemCurrent	-0.0237715	0.0022821	-10.416	< 2e-16	***
PSatisfied	-0.0375713	0.0021776	-17.254	< 2e-16	***
MF	-0.0437938	0.0094164	-4.651	3.32e-06	***
Age	0.0043638	0.0003363	12.978	< 2e-16	***

```
Edu          0.0449268  0.0025585  17.560  < 2e-16 ***
Employment   0.0017367  0.0023104   0.752  0.45224
```

```
---
```

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

```
Residual standard error: 0.8692 on 35570 degrees of freedom
(13360 observations deleted due to missingness)
Multiple R-squared:  0.1092,    Adjusted R-squared:  0.1085
F-statistic: 150.4 on 29 and 35570 DF,  p-value: < 2.2e-16
```

```
summary(CEnvOrg_other_fit)
```

```
Call:
```

```
lm(formula = CEnvOrg ~ . - CReligious - CTelevision - CPolice -
    CCourts - CGovernment - CUniversities - CElections - CMajCompanies -
    CBanks, data = VC_other_numerical_attr)
```

```
Residuals:
```

```
      Min       1Q   Median       3Q      Max
-2.2814 -0.5035 -0.1346  0.5976  2.5308
```

```
Coefficients:
```

```
              Estimate Std. Error t value Pr(>|t|)
(Intercept)   1.6216975   0.0543596   29.833  < 2e-16 ***
TPeople        0.0502981   0.0115901    4.340 1.43e-05 ***
TFamily        0.0325646   0.0084532    3.852 0.000117 ***
TNeighbourhood 0.0416409   0.0068465    6.082 1.20e-09 ***
TKnow          0.0927695   0.0067748   13.693  < 2e-16 ***
TMeet         0.0595926   0.0064264    9.273  < 2e-16 ***
VFriends       0.0113440   0.0063372    1.790 0.073450 .
VReligion      0.0231911   0.0044678    5.191 2.11e-07 ***
HHealth        0.0137869   0.0055984    2.463 0.013797 *
HSatFin        -0.0121731   0.0020437   -5.956 2.60e-09 ***
HFood          0.0317836   0.0064793    4.905 9.37e-07 ***
HCrime         0.0060876   0.0058995    1.032 0.302132
HMedicine      0.0050398   0.0058861    0.856 0.391884
EPrivate       -0.0097158   0.0015905   -6.109 1.02e-09 ***
EGovernment    0.0097493   0.0015042    6.482 9.20e-11 ***
SSecure        0.0792843   0.0059695   13.281  < 2e-16 ***
STOpportunity   -0.0153808   0.0019860   -7.745 9.83e-15 ***
STFaith        0.0083885   0.0015806    5.307 1.12e-07 ***
```

STImportant	0.0116835	0.0015889	7.353	1.98e-13	***
PNewspaper	0.0194278	0.0030395	6.392	1.66e-10	***
PTelevision	0.0167019	0.0037109	4.501	6.79e-06	***
PMobile	0.0188002	0.0032282	5.824	5.80e-09	***
PSocial	-0.0051010	0.0032005	-1.594	0.110990	
PDemImp	-0.0235409	0.0021995	-10.703	< 2e-16	***
PDemCurrent	-0.0193900	0.0021976	-8.823	< 2e-16	***
PSatisfied	-0.0245844	0.0020969	-11.724	< 2e-16	***
MF	-0.0550419	0.0090676	-6.070	1.29e-09	***
Age	0.0040860	0.0003238	12.619	< 2e-16	***
Edu	0.0236342	0.0024637	9.593	< 2e-16	***
Employment	-0.0067628	0.0022248	-3.040	0.002370	**

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

Residual standard error: 0.837 on 35570 degrees of freedom

(13360 observations deleted due to missingness)

Multiple R-squared: 0.08909, Adjusted R-squared: 0.08834

F-statistic: 120 on 29 and 35570 DF, p-value: < 2.2e-16

```
# Extracting all p-values from each linear regression and sorting them to get the top-10 smallest
p_values_CReligious_other = summary(CReligious_other_fit)$coefficients[2:30, "Pr(>|t|)"]
top_10_sorted_p_values_CReligious_other = head(sort(p_values_CReligious_other), 10)

p_values_CTelevision_other = summary(CTelevision_other_fit)$coefficients[2:30, "Pr(>|t|)"]
top_10_sorted_p_values_CTelevision_other = head(sort(p_values_CTelevision_other), 10)

p_values_CPolice_other = summary(CPolice_other_fit)$coefficients[2:30, "Pr(>|t|)"]
top_10_sorted_p_values_CPolice_other = head(sort(p_values_CPolice_other), 10)

p_values_CCourts_other = summary(CCourts_other_fit)$coefficients[2:30, "Pr(>|t|)"]
top_10_sorted_p_values_CCourts_other = head(sort(p_values_CCourts_other), 10)

p_values_CGovernment_other = summary(CGovernment_other_fit)$coefficients[2:30, "Pr(>|t|)"]
top_10_sorted_p_values_CGovernment_other = head(sort(p_values_CGovernment_other), 10)

p_values_CUniversities_other = summary(CUniversities_other_fit)$coefficients[2:30, "Pr(>|t|)"]
```

```

top_10_sorted_p_values_CUniversities_other = head(sort(p_values_CUniversities_other), 10)

p_values_CElections_other = summary(CElections_other_fit)$coefficients[2:30, "Pr(>|t|)"]
top_10_sorted_p_values_CElections_other = head(sort(p_values_CElections_other), 10)

p_values_CMajCompanies_other = summary(CMajCompanies_other_fit)$coefficients[2:30, "Pr(>|t|)"]
top_10_sorted_p_values_CMajCompanies_other = head(sort(p_values_CMajCompanies_other), 10)

p_values_CBanks_other = summary(CBanks_other_fit)$coefficients[2:30, "Pr(>|t|)"]
top_10_sorted_p_values_CBanks_other = head(sort(p_values_CBanks_other), 10)

p_values_CEnvOrg_other = summary(CEnvOrg_other_fit)$coefficients[2:30, "Pr(>|t|)"]
top_10_sorted_p_values_CEnvOrg_other = head(sort(p_values_CEnvOrg_other), 10)

par(mar=c(8, 4, 2, 2), mfrow = c(2,5))

barplot(top_10_sorted_p_values_CReligious_other,
        main = "CReligious for other",
        ylab = "P-values",
        col = "pink",
        las = 2)

barplot(top_10_sorted_p_values_CTelevision_other,
        main = "CTelevision for other",
        ylab = "P-values",
        col = "pink",
        las = 2)

barplot(top_10_sorted_p_values_CPolice_other,
        main = "CPolice for other",
        ylab = "P-values",
        col = "pink",
        las = 2)

barplot(top_10_sorted_p_values_CCourts_other,
        main = "CCourts for other",
        ylab = "P-values",

```

```

        col = "pink",
        las = 2)

barplot(top_10_sorted_p_values_CGovernment_other,
        main = "CGovernment for other",
        ylab = "P-values",
        col = "pink",
        las = 2)

barplot(top_10_sorted_p_values_CUniversities_other,
        main = "CUniversities for other",
        ylab = "P-values",
        col = "pink",
        las = 2)

barplot(top_10_sorted_p_values_CElections_other,
        main = "CElections for other",
        ylab = "P-values",
        col = "pink",
        las = 2)

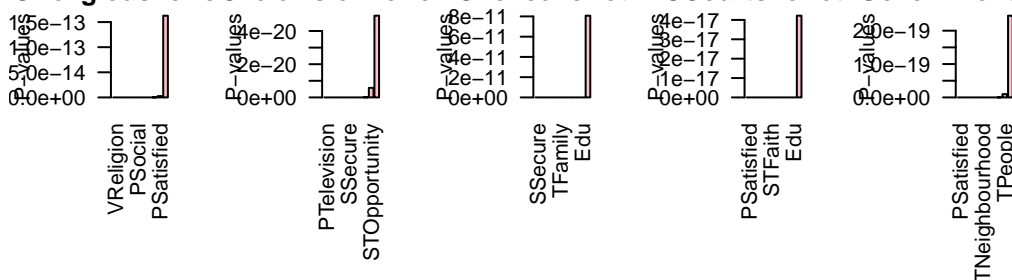
barplot(top_10_sorted_p_values_CMajCompanies_other,
        main = "CMajCompanies for other",
        ylab = "P-values",
        col = "pink",
        las = 2)

barplot(top_10_sorted_p_values_CBanks_other,
        main = "CBanks for other",
        ylab = "P-values",
        col = "pink",
        las = 2)

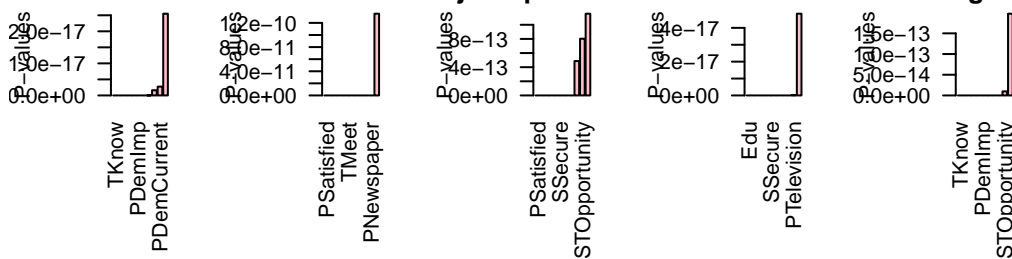
barplot(top_10_sorted_p_values_CEnvOrg_other,
        main = "CEnvOrg for other",
        ylab = "P-values",
        col = "pink",
        las = 2)

```

CReligious for oCTelevision for o CPolice for oth CCourts for othGovernment for oth



Universities for oCElections for oMajorCompanies for oCBanks for oth CEnvOrg for oth



```
par(mfrow = c(1,1))
```

Question 3a code

```
library(cluster)
library(ggrepel)
library(factoextra)

world_data = read.csv("world-data-2023.csv")

# Extract indicators
external_data = world_data[, c(1,7,10,11,14,16:20,22,23,26,27,29,32)]

# Handle missing values
for (col in names(external_data)) {
  external_data[[col]][external_data[[col]] == ""] <- NA
}

external_data = na.omit(external_data)

# Change character data types to numerical data types
```

```

for (col in names(external_data)[-1]) { # skip "Country"
  if (is.character(external_data[[col]])) {
    external_data[[col]] <- as.numeric(gsub("$,%", "", gsub(",", "", external_data[[col]])))
  }
}

external_data[, 2:length(external_data)] = scale(external_data[, 2:length(external_data)])

# Plotting average silhouette score graph
silhouette_value <- function(k) {
  km <- kmeans(external_data[, 2:length(external_data)], k, nstart = 1)
  ss <- silhouette(km$cluster, dist(external_data[, 2:length(external_data)]))
  mean(ss[, 3])
}

# Plot average silhouette score for 2-16 clusters on a line graph
k <- 2:length(external_data)
avg_sil <- sapply(k, silhouette_value)
# plot(k, type='b', avg_sil, xlab='Number of clusters', ylab='Average Silhouette Scores')

# Checking the best number of k-clusters
best_k <- k[which.max(avg_sil)]

best_k

```

```
[1] 3
```

```

# K-means clustering and create cluster plot
cluster_fit = kmeans(external_data[, 2:length(external_data)], best_k, nstart = 20)

cluster_fit$cluster <- factor(cluster_fit$cluster)

rownames(external_data) = external_data$Country

p <- fviz_cluster(cluster_fit, data = external_data[, 2:length(external_data)],
  ggtheme = theme_minimal())

```

Question 3b code

```

VC_similar = VC[VC$Country %in% c("URY", "NZL", "CYP", "NLD", "CHL"), ]

VC_similar_numerical_attr = VC_SGP[, 2:40]

CReligious_similar_fit = lm(CReligious ~.-CTelevision-CPolice-CCourts-CGovernment-CUniversities)
CTelevision_similar_fit = lm(CTelevision ~.-CReligious-CPolice-CCourts-CGovernment-CUniversities)
CPolice_similar_fit = lm(CPolice ~.-CReligious-CTelevision-CCourts-CGovernment-CUniversities)
CCourts_similar_fit = lm(CCourts ~.-CReligious-CTelevision-CPolice-CGovernment-CUniversities)
CGovernment_similar_fit = lm(CGovernment ~.-CReligious-CTelevision-CPolice-CCourts-CUniversities)
CUniversities_similar_fit = lm(CUniversities ~.-CReligious-CTelevision-CPolice-CCourts-CGovernment)
CElections_similar_fit = lm(CElections ~.-CReligious-CTelevision-CPolice-CCourts-CGovernment)
CMajCompanies_similar_fit = lm(CMajCompanies ~.-CReligious-CTelevision-CPolice-CCourts-CGovernment)
CBanks_similar_fit = lm(CBanks ~.-CReligious-CTelevision-CPolice-CCourts-CGovernment-CUniversities)
CEnvOrg_similar_fit = lm(CEnvOrg ~.-CReligious-CTelevision-CPolice-CCourts-CGovernment-CUniversities)

summary(CReligious_similar_fit)

```

Call:

```

lm(formula = CReligious ~ . - CTelevision - CPolice - CCourts -
    CGovernment - CUniversities - CElections - CMajCompanies -
    CBanks - CEnvOrg, data = VC_similar_numerical_attr)

```

Residuals:

Min	1Q	Median	3Q	Max
-1.7054	-0.4144	0.0015	0.3933	2.3033

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	6.219e-01	4.004e-01	1.553	0.120785
TPeople	1.544e-02	5.329e-02	0.290	0.772141
TFamily	9.219e-02	4.950e-02	1.862	0.062919

TNeighbourhood	1.739e-01	4.789e-02	3.630	0.000301	***
TKnow	1.397e-01	4.713e-02	2.964	0.003129	**
TMeet	-2.433e-02	4.176e-02	-0.583	0.560390	
VFriends	-2.852e-02	3.855e-02	-0.740	0.459677	
VReligion	3.146e-01	2.420e-02	13.001	< 2e-16	***
HHealth	-5.412e-03	3.231e-02	-0.168	0.867011	
HSatFin	-1.893e-02	1.321e-02	-1.434	0.152108	
HFood	7.424e-02	7.077e-02	1.049	0.294495	
HCrime	-4.556e-02	5.085e-02	-0.896	0.370555	
HMedicine	-1.421e-02	6.340e-02	-0.224	0.822711	
EPrivate	-8.142e-03	1.153e-02	-0.706	0.480291	
EGovernment	1.339e-02	1.000e-02	1.338	0.181236	
SSecure	1.089e-01	4.079e-02	2.669	0.007772	**
STOpportunity	1.809e-02	1.273e-02	1.421	0.155593	
STFaith	-5.269e-03	1.010e-02	-0.522	0.601930	
STImportant	-7.240e-04	1.047e-02	-0.069	0.944891	
PNewspaper	3.843e-02	1.607e-02	2.392	0.016991	*
PTelevision	2.547e-02	1.882e-02	1.354	0.176198	
PMobile	-1.885e-02	2.067e-02	-0.912	0.362114	
PSocial	1.769e-02	1.829e-02	0.967	0.333848	
PDemImp	2.522e-02	1.449e-02	1.741	0.082164	.
PDemCurrent	-2.265e-02	1.681e-02	-1.347	0.178251	
PSatisfied	-2.782e-02	1.627e-02	-1.710	0.087704	.
MF	-1.667e-03	4.723e-02	-0.035	0.971855	
Age	-4.576e-05	1.992e-03	-0.023	0.981677	
Edu	2.612e-02	1.552e-02	1.683	0.092724	.
Employment	1.166e-02	1.139e-02	1.024	0.306129	

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

Residual standard error: 0.6457 on 778 degrees of freedom
(232 observations deleted due to missingness)

Multiple R-squared: 0.3378, Adjusted R-squared: 0.3132

F-statistic: 13.69 on 29 and 778 DF, p-value: < 2.2e-16

```
summary(CTelevision_similar_fit)
```

Call:

```
lm(formula = CTelevision ~ . - CReligious - CPolice - CCourts -  
    CGovernment - CUniversities - CElections - CMajCompanies -  
    CBanks - CEnvOrg, data = VC_similar_numerical_attr)
```

Residuals:

	Min	1Q	Median	3Q	Max
	-1.68760	-0.40151	-0.02371	0.43569	1.83608

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)	
(Intercept)	1.373e+00	3.699e-01	3.711	0.000221	***
TPeople	2.097e-02	4.923e-02	0.426	0.670239	
TFamily	2.705e-02	4.574e-02	0.591	0.554460	
TNeighbourhood	3.927e-02	4.425e-02	0.887	0.375092	
TKnow	7.432e-02	4.355e-02	1.707	0.088277	.
TMeet	6.381e-02	3.858e-02	1.654	0.098579	.
VFriends	3.999e-02	3.562e-02	1.123	0.261910	
VReligion	-1.997e-04	2.235e-02	-0.009	0.992874	
HHealth	5.123e-03	2.985e-02	0.172	0.863757	
HSatFin	2.408e-02	1.220e-02	1.974	0.048765	*
HFood	-2.300e-02	6.538e-02	-0.352	0.725147	
HCrime	1.181e-01	4.698e-02	2.515	0.012110	*
HMedicine	-8.545e-02	5.858e-02	-1.459	0.145062	
EPrivate	-1.045e-02	1.065e-02	-0.981	0.326911	
EGovernment	6.588e-05	9.243e-03	0.007	0.994315	
SSecure	1.533e-01	3.769e-02	4.068	5.23e-05	***
STOpportunity	-2.615e-02	1.176e-02	-2.224	0.026449	*
STFaith	1.421e-02	9.329e-03	1.523	0.128117	
STImportant	-1.903e-02	9.674e-03	-1.967	0.049492	*
PNewspaper	4.946e-03	1.484e-02	0.333	0.739057	
PTelevision	7.079e-02	1.739e-02	4.072	5.14e-05	***
PMobile	2.450e-02	1.910e-02	1.282	0.200078	
PSocial	4.079e-03	1.690e-02	0.241	0.809342	
PDemImp	3.032e-02	1.339e-02	2.265	0.023778	*
PDemCurrent	-2.089e-02	1.553e-02	-1.345	0.179043	
PSatisfied	-5.979e-02	1.503e-02	-3.977	7.63e-05	***
MF	-9.179e-02	4.363e-02	-2.104	0.035728	*
Age	1.196e-03	1.840e-03	0.650	0.515866	
Edu	9.182e-02	1.433e-02	6.405	2.60e-10	***
Employment	1.788e-02	1.052e-02	1.699	0.089626	.

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

Residual standard error: 0.5966 on 778 degrees of freedom

(232 observations deleted due to missingness)

Multiple R-squared: 0.2484, Adjusted R-squared: 0.2204

F-statistic: 8.868 on 29 and 778 DF, p-value: < 2.2e-16

```
summary(CPolice_similar_fit)
```

Call:

```
lm(formula = CPolice ~ . - CReligious - CTelevision - CCourts -  
    CGovernment - CUniversities - CElections - CMajCompanies -  
    CBanks - CEnvOrg, data = VC_similar_numerical_attr)
```

Residuals:

	Min	1Q	Median	3Q	Max
	-1.45966	-0.45414	0.04605	0.30873	2.41223

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)	
(Intercept)	1.3768680	0.3753589	3.668	0.000261	***
TPeople	0.1075058	0.0499553	2.152	0.031701	*
TFamily	0.0991565	0.0464058	2.137	0.032932	*
TNeighbourhood	0.0954778	0.0448966	2.127	0.033766	*
TKnow	0.1388301	0.0441836	3.142	0.001741	**
TMeet	-0.0794626	0.0391488	-2.030	0.042721	*
VFriends	0.0065152	0.0361418	0.180	0.856989	
VReligion	0.0218664	0.0226818	0.964	0.335319	
HHealth	-0.0350556	0.0302853	-1.158	0.247419	
HSatFin	-0.0047989	0.0123806	-0.388	0.698405	
HFood	0.1109680	0.0663404	1.673	0.094787	.
HCrime	-0.0370378	0.0476672	-0.777	0.437390	
HMedicine	-0.0379234	0.0594365	-0.638	0.523629	
EPrivate	-0.0143972	0.0108083	-1.332	0.183234	
EGovernment	-0.0060337	0.0093788	-0.643	0.520201	
SSecure	0.1847906	0.0382394	4.832	1.62e-06	***
STOpportunity	-0.0092476	0.0119333	-0.775	0.438610	
STFaith	0.0059130	0.0094658	0.625	0.532374	
STImportant	-0.0148291	0.0098155	-1.511	0.131249	
PNewspaper	-0.0107666	0.0150605	-0.715	0.474891	
PTelevision	0.0455606	0.0176405	2.583	0.009984	**
PMobile	0.0252953	0.0193815	1.305	0.192235	
PSocial	0.0045400	0.0171476	0.265	0.791266	
PDemImp	0.0037765	0.0135832	0.278	0.781065	
PDemCurrent	-0.0263736	0.0157606	-1.673	0.094653	.
PSatisfied	-0.0462618	0.0152535	-3.033	0.002503	**

MF	0.0190112	0.0442726	0.429	0.667742
Age	0.0008064	0.0018671	0.432	0.665944
Edu	-0.0097569	0.0145448	-0.671	0.502538
Employment	0.0201444	0.0106751	1.887	0.059526 .

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

Residual standard error: 0.6053 on 778 degrees of freedom

(232 observations deleted due to missingness)

Multiple R-squared: 0.2099, Adjusted R-squared: 0.1804

F-statistic: 7.126 on 29 and 778 DF, p-value: < 2.2e-16

```
summary(CCourts_similar_fit)
```

Call:

```
lm(formula = CCourts ~ . - CReligious - CTelevision - CPolice -
    CGovernment - CUniversities - CElections - CMajCompanies -
    CBanks - CEnvOrg, data = VC_similar_numerical_attr)
```

Residuals:

	Min	1Q	Median	3Q	Max
	-1.52800	-0.42435	0.02223	0.34312	2.15355

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)	
(Intercept)	1.7399614	0.4018263	4.330	1.69e-05	***
TPeople	0.0299560	0.0534778	0.560	0.57553	
TFamily	0.0403954	0.0496780	0.813	0.41638	
TNeighbourhood	0.0750752	0.0480623	1.562	0.11869	
TKnow	0.0681904	0.0472991	1.442	0.14979	
TMeet	0.0574817	0.0419092	1.372	0.17059	
VFriends	0.0018033	0.0386902	0.047	0.96284	
VReligion	0.0158406	0.0242811	0.652	0.51435	
HHealth	-0.0381987	0.0324208	-1.178	0.23907	
HSatFin	-0.0178041	0.0132536	-1.343	0.17955	
HFood	0.1362001	0.0710182	1.918	0.05550	.
HCrime	-0.0164800	0.0510283	-0.323	0.74681	
HMedicine	-0.0600394	0.0636275	-0.944	0.34566	
EPrivate	-0.0139535	0.0115704	-1.206	0.22820	
EGovernment	-0.0105320	0.0100401	-1.049	0.29451	
SSecure	0.1015356	0.0409358	2.480	0.01334	*

STOpportunity	-0.0206699	0.0127748	-1.618	0.10606
STFaith	0.0043716	0.0101333	0.431	0.66629
STImportant	0.0070079	0.0105076	0.667	0.50501
PNewspaper	0.0236079	0.0161225	1.464	0.14352
PTelevision	0.0227841	0.0188844	1.207	0.22799
PMobile	0.0180648	0.0207481	0.871	0.38420
PSocial	0.0001796	0.0183567	0.010	0.99220
PDemImp	0.0038995	0.0145410	0.268	0.78864
PDemCurrent	-0.0428799	0.0168719	-2.541	0.01123 *
PSatisfied	-0.0534263	0.0163291	-3.272	0.00112 **
MF	-0.0215798	0.0473943	-0.455	0.64900
Age	0.0027908	0.0019987	1.396	0.16302
Edu	-0.0099307	0.0155704	-0.638	0.52379
Employment	0.0156740	0.0114278	1.372	0.17059

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

Residual standard error: 0.648 on 778 degrees of freedom
(232 observations deleted due to missingness)

Multiple R-squared: 0.1795, Adjusted R-squared: 0.1489

F-statistic: 5.867 on 29 and 778 DF, p-value: < 2.2e-16

```
summary(CGovernment_similar_fit)
```

Call:

```
lm(formula = CGovernment ~ . - CReligious - CTelevision - CPolice -  
    CCourts - CUniversities - CElections - CMajCompanies - CBanks -  
    CEnvOrg, data = VC_similar_numerical_attr)
```

Residuals:

	Min	1Q	Median	3Q	Max
	-1.66035	-0.40029	0.01506	0.35363	2.22190

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)	
(Intercept)	2.073499	0.366466	5.658	2.15e-08	***
TPeople	0.060701	0.048772	1.245	0.21365	
TFamily	0.040506	0.045306	0.894	0.37157	
TNeighbourhood	0.017384	0.043833	0.397	0.69177	
TKnow	0.183767	0.043137	4.260	2.29e-05	***
TMeet	-0.010215	0.038221	-0.267	0.78934	

VFriends	-0.024972	0.035285	-0.708	0.47933
VReligion	0.013155	0.022144	0.594	0.55264
HHealth	0.030973	0.029568	1.048	0.29518
HSatFin	-0.003846	0.012087	-0.318	0.75046
HFood	0.059406	0.064769	0.917	0.35932
HCrime	0.019168	0.046538	0.412	0.68054
HMedicine	-0.064301	0.058028	-1.108	0.26816
EPrivate	-0.023866	0.010552	-2.262	0.02399 *
EGovernment	-0.025690	0.009157	-2.806	0.00515 **
SSecure	0.196060	0.037333	5.252	1.95e-07 ***
STOpportunity	-0.002183	0.011651	-0.187	0.85140
STFaith	0.005637	0.009242	0.610	0.54204
STImportant	-0.009164	0.009583	-0.956	0.33922
PNewspaper	0.009461	0.014704	0.643	0.52015
PTelevision	0.040166	0.017223	2.332	0.01995 *
PMobile	0.026935	0.018922	1.423	0.15500
PSocial	-0.006191	0.016741	-0.370	0.71162
PDemImp	0.033876	0.013261	2.554	0.01082 *
PDemCurrent	-0.048440	0.015387	-3.148	0.00171 **
PSatisfied	-0.099937	0.014892	-6.711	3.73e-11 ***
MF	-0.106373	0.043224	-2.461	0.01407 *
Age	-0.002522	0.001823	-1.383	0.16693
Edu	0.026856	0.014200	1.891	0.05896 .
Employment	0.005756	0.010422	0.552	0.58092

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

Residual standard error: 0.5909 on 778 degrees of freedom

(232 observations deleted due to missingness)

Multiple R-squared: 0.3514, Adjusted R-squared: 0.3272

F-statistic: 14.54 on 29 and 778 DF, p-value: < 2.2e-16

```
summary(CUniversities_similar_fit)
```

Call:

```
lm(formula = CUniversities ~ . - CReligious - CTelevision - CPolice -
    CCourts - CGovernment - CElections - CMajCompanies - CBanks -
    CEnvOrg, data = VC_similar_numerical_attr)
```

Residuals:

Min	1Q	Median	3Q	Max
-----	----	--------	----	-----

-1.42827 -0.33025 -0.00496 0.26483 2.29829

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)	
(Intercept)	1.4174103	0.3628439	3.906	0.000102	***
TPeople	-0.0233759	0.0482897	-0.484	0.628468	
TFamily	0.0866363	0.0448586	1.931	0.053806	.
TNeighbourhood	-0.0275581	0.0433997	-0.635	0.525626	
TKnow	0.1877714	0.0427105	4.396	1.25e-05	***
TMeet	0.0260172	0.0378435	0.687	0.491976	
VFriends	0.0091049	0.0349367	0.261	0.794461	
VReligion	-0.0087521	0.0219255	-0.399	0.689876	
HHealth	0.0195292	0.0292756	0.667	0.504918	
HSatFin	-0.0040864	0.0119678	-0.341	0.732860	
HFood	0.0783382	0.0641285	1.222	0.222236	
HCrime	0.0032629	0.0460779	0.071	0.943565	
HMedicine	-0.0658295	0.0574548	-1.146	0.252246	
EPrivate	-0.0152534	0.0104479	-1.460	0.144709	
EGovernment	-0.0022966	0.0090661	-0.253	0.800092	
SSecure	0.1877700	0.0369645	5.080	4.73e-07	***
STOpportunity	0.0064467	0.0115354	0.559	0.576419	
STFaith	0.0162600	0.0091502	1.777	0.075958	.
STImportant	0.0110089	0.0094882	1.160	0.246296	
PNewspaper	0.0089184	0.0145584	0.613	0.540321	
PTelevision	0.0352056	0.0170523	2.065	0.039295	*
PMobile	0.0168886	0.0187353	0.901	0.367638	
PSocial	-0.0033857	0.0165759	-0.204	0.838207	
PDemImp	-0.0120933	0.0131303	-0.921	0.357323	
PDemCurrent	-0.0198153	0.0152351	-1.301	0.193769	
PSatisfied	-0.0330361	0.0147450	-2.240	0.025340	*
MF	0.0019242	0.0427965	0.045	0.964149	
Age	-0.0003091	0.0018048	-0.171	0.864072	
Edu	-0.0080698	0.0140599	-0.574	0.566163	
Employment	0.0024955	0.0103192	0.242	0.808973	

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

Residual standard error: 0.5851 on 778 degrees of freedom

(232 observations deleted due to missingness)

Multiple R-squared: 0.1752, Adjusted R-squared: 0.1445

F-statistic: 5.7 on 29 and 778 DF, p-value: < 2.2e-16

```
summary(CElections_similar_fit)
```

Call:

```
lm(formula = CElections ~ . - CReligious - CTelevision - CPolice -  
    CCourts - CGovernment - CUniversities - CMajCompanies - CBanks -  
    CEnvOrg, data = VC_similar_numerical_attr)
```

Residuals:

Min	1Q	Median	3Q	Max
-1.97731	-0.41241	-0.01293	0.42822	1.90467

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)	
(Intercept)	2.629020	0.395108	6.654	5.38e-11	***
TPeople	0.017932	0.052584	0.341	0.733183	
TFamily	0.037370	0.048847	0.765	0.444481	
TNeighbourhood	0.026479	0.047259	0.560	0.575437	
TKnow	0.123120	0.046508	2.647	0.008279	**
TMeet	0.044414	0.041208	1.078	0.281458	
VFriends	-0.069025	0.038043	-1.814	0.070004	.
VReligion	0.025834	0.023875	1.082	0.279568	
HHealth	0.034061	0.031879	1.068	0.285643	
HSatFin	-0.002312	0.013032	-0.177	0.859251	
HFood	0.093395	0.069831	1.337	0.181470	
HCrime	0.009630	0.050175	0.192	0.847848	
HMedicine	-0.115035	0.062564	-1.839	0.066343	.
EPrivate	-0.037581	0.011377	-3.303	0.000999	***
EGovernment	-0.012975	0.009872	-1.314	0.189130	
SSecure	0.175063	0.040251	4.349	1.55e-05	***
STOpportunity	-0.004486	0.012561	-0.357	0.721079	
STFaith	-0.012218	0.009964	-1.226	0.220498	
STImportant	0.014106	0.010332	1.365	0.172556	
PNewspaper	0.026170	0.015853	1.651	0.099181	.
PTelevision	0.012943	0.018569	0.697	0.485973	
PMobile	0.010868	0.020401	0.533	0.594387	
PSocial	-0.020741	0.018050	-1.149	0.250869	
PDemImp	0.001918	0.014298	0.134	0.893312	
PDemCurrent	-0.045406	0.016590	-2.737	0.006342	**
PSatisfied	-0.085722	0.016056	-5.339	1.23e-07	***
MF	-0.042251	0.046602	-0.907	0.364878	
Age	-0.001441	0.001965	-0.733	0.463568	

Edu	0.013418	0.015310	0.876	0.381068
Employment	-0.001495	0.011237	-0.133	0.894221

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

Residual standard error: 0.6371 on 778 degrees of freedom

(232 observations deleted due to missingness)

Multiple R-squared: 0.2746, Adjusted R-squared: 0.2476

F-statistic: 10.16 on 29 and 778 DF, p-value: < 2.2e-16

```
summary(CMajCompanies_similar_fit)
```

Call:

```
lm(formula = CMajCompanies ~ . - CReligious - CTelevision - CPolice -
    CCourts - CGovernment - CUniversities - CElections - CBanks -
    CEnvOrg, data = VC_similar_numerical_attr)
```

Residuals:

	Min	1Q	Median	3Q	Max
	-1.8121	-0.3911	-0.1552	0.5027	1.8076

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)	
(Intercept)	1.611018	0.369086	4.365	1.44e-05	***
TPeople	-0.022880	0.049120	-0.466	0.64149	
TFamily	0.081110	0.045630	1.778	0.07587	.
TNeighbourhood	0.037886	0.044146	0.858	0.39105	
TKnow	0.108838	0.043445	2.505	0.01244	*
TMeet	0.052461	0.038495	1.363	0.17333	
VFriends	-0.026333	0.035538	-0.741	0.45892	
VReligion	0.024289	0.022303	1.089	0.27646	
HHealth	0.087024	0.029779	2.922	0.00358	**
HSatFin	-0.004928	0.012174	-0.405	0.68571	
HFood	-0.009186	0.065232	-0.141	0.88804	
HCrime	0.034491	0.046871	0.736	0.46203	
HMedicine	-0.035115	0.058443	-0.601	0.54813	
EPrivate	-0.006755	0.010628	-0.636	0.52525	
EGovernment	-0.002237	0.009222	-0.243	0.80838	
SSecure	0.095570	0.037600	2.542	0.01122	*
STOpportunity	-0.011327	0.011734	-0.965	0.33469	
STFaith	-0.006805	0.009308	-0.731	0.46492	

STImportant	0.008699	0.009651	0.901	0.36773
PNewspaper	0.025042	0.014809	1.691	0.09124 .
PTelevision	0.011962	0.017346	0.690	0.49062
PMobile	0.029866	0.019058	1.567	0.11749
PSocial	0.005693	0.016861	0.338	0.73571
PDemImp	0.018269	0.013356	1.368	0.17176
PDemCurrent	-0.025519	0.015497	-1.647	0.10002
PSatisfied	-0.032373	0.014999	-2.158	0.03120 *
MF	-0.047020	0.043533	-1.080	0.28043
Age	0.002107	0.001836	1.148	0.25152
Edu	0.039634	0.014302	2.771	0.00572 **
Employment	0.004493	0.010497	0.428	0.66875

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

Residual standard error: 0.5952 on 778 degrees of freedom

(232 observations deleted due to missingness)

Multiple R-squared: 0.1427, Adjusted R-squared: 0.1108

F-statistic: 4.466 on 29 and 778 DF, p-value: 2.388e-13

```
summary(CBanks_similar_fit)
```

Call:

```
lm(formula = CBanks ~ . - CReligious - CTelevision - CPolice -
    CCourts - CGovernment - CUniversities - CElections - CMajCompanies -
    CEnvOrg, data = VC_similar_numerical_attr)
```

Residuals:

	Min	1Q	Median	3Q	Max
	-1.76677	-0.31612	-0.02818	0.30708	2.08978

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)	
(Intercept)	1.476893	0.384385	3.842	0.000132	***
TPeople	-0.018600	0.051157	-0.364	0.716262	
TFamily	0.096166	0.047522	2.024	0.043351	*
TNeighbourhood	0.061915	0.045976	1.347	0.178475	
TKnow	0.174767	0.045246	3.863	0.000122	***
TMeet	-0.025535	0.040090	-0.637	0.524358	
VFriends	-0.054455	0.037011	-1.471	0.141610	
VReligion	0.057121	0.023227	2.459	0.014140	*

HHealth	0.065265	0.031014	2.104	0.035664	*
HSatFin	-0.010168	0.012678	-0.802	0.422792	
HFood	0.142642	0.067936	2.100	0.036081	*
HCrime	-0.045858	0.048813	-0.939	0.347790	
HMedicine	-0.093655	0.060866	-1.539	0.124279	
EPrivate	-0.011659	0.011068	-1.053	0.292496	
EGovernment	-0.001032	0.009604	-0.107	0.914458	
SSecure	0.142004	0.039159	3.626	0.000306	***
STOpportunity	-0.008498	0.012220	-0.695	0.487008	
STFaith	-0.002442	0.009693	-0.252	0.801200	
STImportant	0.010988	0.010052	1.093	0.274678	
PNewspaper	0.020737	0.015423	1.345	0.179152	
PTelevision	0.017806	0.018065	0.986	0.324585	
PMobile	-0.010195	0.019848	-0.514	0.607639	
PSocial	0.012018	0.017560	0.684	0.493928	
PDemImp	0.021690	0.013910	1.559	0.119324	
PDemCurrent	-0.042536	0.016140	-2.636	0.008568	**
PSatisfied	-0.012286	0.015620	-0.787	0.431802	
MF	-0.006437	0.045337	-0.142	0.887140	
Age	-0.002502	0.001912	-1.309	0.191000	
Edu	0.020179	0.014895	1.355	0.175868	
Employment	0.001246	0.010932	0.114	0.909248	

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

Residual standard error: 0.6198 on 778 degrees of freedom

(232 observations deleted due to missingness)

Multiple R-squared: 0.1772, Adjusted R-squared: 0.1465

F-statistic: 5.776 on 29 and 778 DF, p-value: < 2.2e-16

```
summary(CEnvOrg_similar_fit)
```

Call:

```
lm(formula = CEnvOrg ~ . - CReligious - CTelevision - CPolice -
    CCourts - CGovernment - CUniversities - CElections - CMajCompanies -
    CBanks, data = VC_similar_numerical_attr)
```

Residuals:

	Min	1Q	Median	3Q	Max
	-1.60443	-0.30870	-0.08679	0.35766	2.11010

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)	
(Intercept)	1.875203	0.373148	5.025	6.24e-07	***
TPeople	-0.056221	0.049661	-1.132	0.25794	
TFamily	0.094909	0.046132	2.057	0.03999	*
TNeighbourhood	0.024040	0.044632	0.539	0.59030	
TKnow	0.164717	0.043923	3.750	0.00019	***
TMeet	0.029157	0.038918	0.749	0.45398	
VFriends	0.013456	0.035929	0.375	0.70812	
VReligion	-0.009758	0.022548	-0.433	0.66529	
HHealth	-0.000625	0.030107	-0.021	0.98344	
HSatFin	-0.015759	0.012308	-1.280	0.20079	
HFood	0.041023	0.065950	0.622	0.53410	
HCrime	0.001619	0.047386	0.034	0.97276	
HMedicine	-0.036042	0.059086	-0.610	0.54205	
EPrivate	-0.011166	0.010745	-1.039	0.29904	
EGovernment	0.005554	0.009324	0.596	0.55154	
SSecure	0.134413	0.038014	3.536	0.00043	***
STOpportunity	-0.021429	0.011863	-1.806	0.07125	.
STFaith	0.002789	0.009410	0.296	0.76699	
STImportant	0.003439	0.009758	0.352	0.72462	
PNewspaper	-0.004104	0.014972	-0.274	0.78406	
PTelevision	0.036016	0.017537	2.054	0.04033	*
PMobile	0.001863	0.019267	0.097	0.92298	
PSocial	-0.015451	0.017047	-0.906	0.36499	
PDemImp	-0.017764	0.013503	-1.316	0.18871	
PDemCurrent	-0.018884	0.015668	-1.205	0.22845	
PSatisfied	-0.029799	0.015164	-1.965	0.04975	*
MF	-0.064279	0.044012	-1.461	0.14456	
Age	0.003640	0.001856	1.961	0.05022	.
Edu	0.036799	0.014459	2.545	0.01112	*
Employment	0.012971	0.010612	1.222	0.22197	

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

Residual standard error: 0.6017 on 778 degrees of freedom

(232 observations deleted due to missingness)

Multiple R-squared: 0.1497, Adjusted R-squared: 0.118

F-statistic: 4.721 on 29 and 778 DF, p-value: 1.901e-14

```
p_values_CReligious_similar = summary(CReligious_similar_fit)$coefficients[2:30, "Pr(>|t|)"]
top_10_sorted_p_values_CReligious_similar = head(sort(p_values_CReligious_similar), 10)
```

```

p_values_CTelevision_similar = summary(CTelevision_similar_fit)$coefficients[2:30, "Pr(>|t|)"]
top_10_sorted_p_values_CTelevision_similar = head(sort(p_values_CTelevision_similar), 10)

p_values_CPolice_similar = summary(CPolice_similar_fit)$coefficients[2:30, "Pr(>|t|)"]
top_10_sorted_p_values_CPolice_similar = head(sort(p_values_CPolice_similar), 10)

p_values_CCourts_similar = summary(CCourts_similar_fit)$coefficients[2:30, "Pr(>|t|)"]
top_10_sorted_p_values_CCourts_similar = head(sort(p_values_CCourts_similar), 10)

p_values_CGovernment_similar = summary(CGovernment_similar_fit)$coefficients[2:30, "Pr(>|t|)"]
top_10_sorted_p_values_CGovernment_similar = head(sort(p_values_CGovernment_similar), 10)

p_values_CUniversities_similar = summary(CUniversities_similar_fit)$coefficients[2:30, "Pr(>|t|)"]
top_10_sorted_p_values_CUniversities_similar = head(sort(p_values_CUniversities_similar), 10)

p_values_CElections_similar = summary(CElections_similar_fit)$coefficients[2:30, "Pr(>|t|)"]
top_10_sorted_p_values_CElections_similar = head(sort(p_values_CElections_similar), 10)

p_values_CMajCompanies_similar = summary(CMajCompanies_similar_fit)$coefficients[2:30, "Pr(>|t|)"]
top_10_sorted_p_values_CMajCompanies_similar = head(sort(p_values_CMajCompanies_similar), 10)

p_values_CBanks_similar = summary(CBanks_similar_fit)$coefficients[2:30, "Pr(>|t|)"]
top_10_sorted_p_values_CBanks_similar = head(sort(p_values_CBanks_similar), 10)

p_values_CEnvOrg_similar = summary(CEnvOrg_similar_fit)$coefficients[2:30, "Pr(>|t|)"]
top_10_sorted_p_values_CEnvOrg_similar = head(sort(p_values_CEnvOrg_similar), 10)

par(mar=c(8, 4, 2, 2), mfrow = c(2,5))

barplot(top_10_sorted_p_values_CReligious_similar,
        main = "CReligious for similar",
        ylab = "P-values",

```

```

        col = "lightyellow",
        las = 2)

barplot(top_10_sorted_p_values_CTelevision_similar,
        main = "CTelevision for similar",
        ylab = "P-values",
        col = "lightyellow",
        las = 2)

barplot(top_10_sorted_p_values_CPolice_similar,
        main = "CPolice for similar",
        ylab = "P-values",
        col = "lightyellow",
        las = 2)

barplot(top_10_sorted_p_values_CCourts_similar,
        main = "CCourts for similar",
        ylab = "P-values",
        col = "lightyellow",
        las = 2)

barplot(top_10_sorted_p_values_CGovernment_similar,
        main = "CGovernment for similar",
        ylab = "P-values",
        col = "lightyellow",
        las = 2)

barplot(top_10_sorted_p_values_CUniversities_similar,
        main = "CUniversities for similar",
        ylab = "P-values",
        col = "lightyellow",
        las = 2)

barplot(top_10_sorted_p_values_CElections_similar,
        main = "CElections for similar",
        ylab = "P-values",
        col = "lightyellow",
        las = 2)

barplot(top_10_sorted_p_values_CMajCompanies_similar,
        main = "CMajCompanies for similar",
        ylab = "P-values",

```

```

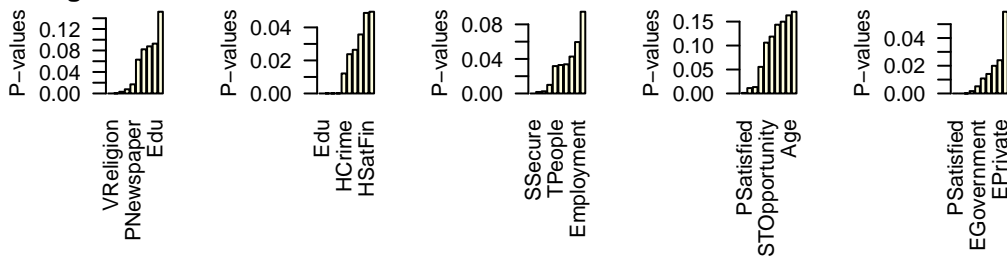
col = "lightyellow",
las = 2)

barplot(top_10_sorted_p_values_CBanks_similar,
main = "CBanks for similar",
ylab = "P-values",
col = "lightyellow",
las = 2)

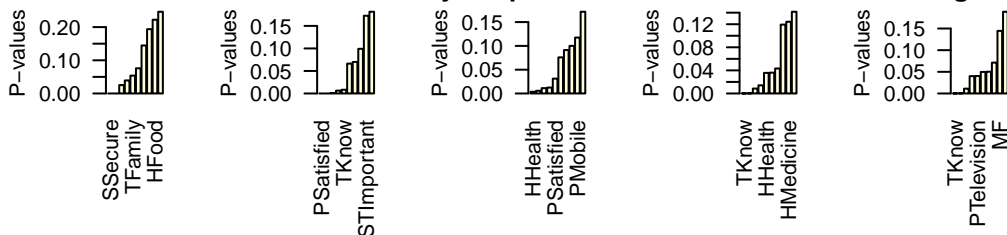
barplot(top_10_sorted_p_values_CEnvOrg_similar,
main = "CEnvOrg for similar",
ylab = "P-values",
col = "lightyellow",
las = 2)

```

CReligious for si **CTelevision for si** **CPolice for simi** **CCourts for sim** **Government for s**



Universities for s **Elections for siraj** **Companies for** **CBanks for simi** **CEnvOrg for sim**



```

par(mfrow = c(1,1))

```

Figures

column	missing_count
Country	0
TPeople	649
TFamily	138
TNeighbourhood	392
TKnow	278
TMeet	669
VFriends	156
VReligion	480
HHealth	121
HSatFin	310
HFood	248
HCrime	281
HMedicine	292
EPrivate	1730
EGovernment	579
SSecure	328
STOpportunity	1408
STFaith	1929
STImportant	1751
PNewspaper	463
PTelevision	282
PMobile	491
PSocial	1851
PDemImp	926
PDemCurrent	1377
PSatisfied	1848
MF	51
Age	246
Edu	520
Employment	606
CReligious	1016
CTelevision	715
CPolice	1193
CCourts	1760
CGovernment	1563
CUniversities	1977
CElections	1930
CMajCompanies	2706
CBanks	1447
CEnvOrg	3257

Figure 11: *Figure 1a.1: Total Number of Missing Values per Column*

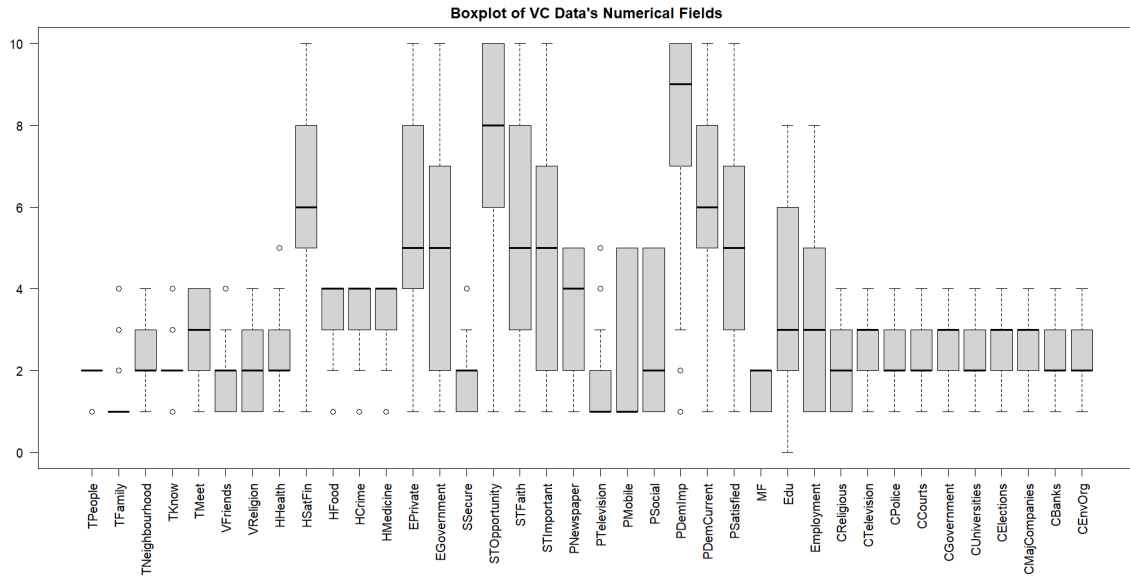


Figure 12: *Figure 1a.2: Distribution of Numerical Attributes (Excluding 'Age' Attribute)*

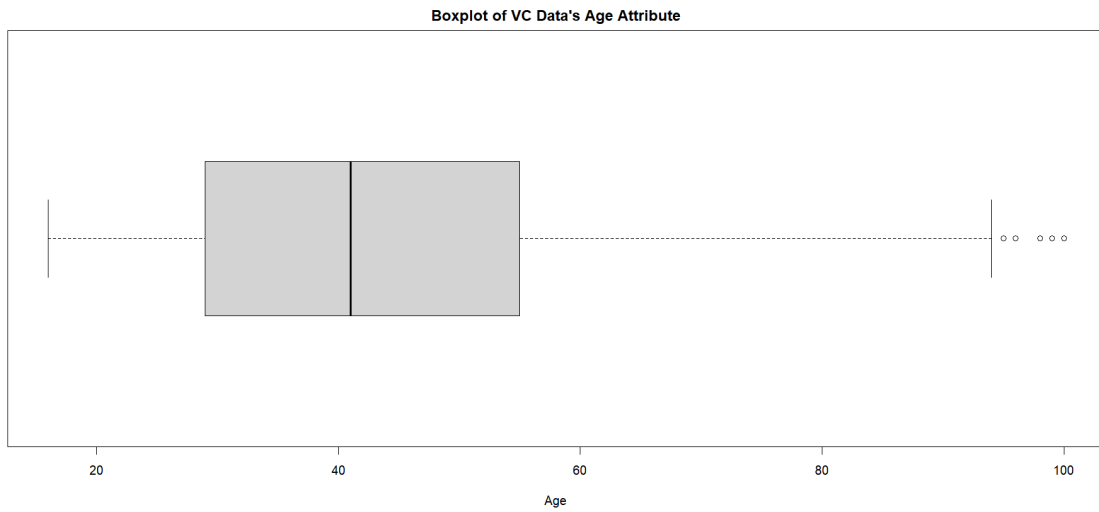


Figure 13: *Figure 1a.3: Distribution of Numerical Attribute (Age)*

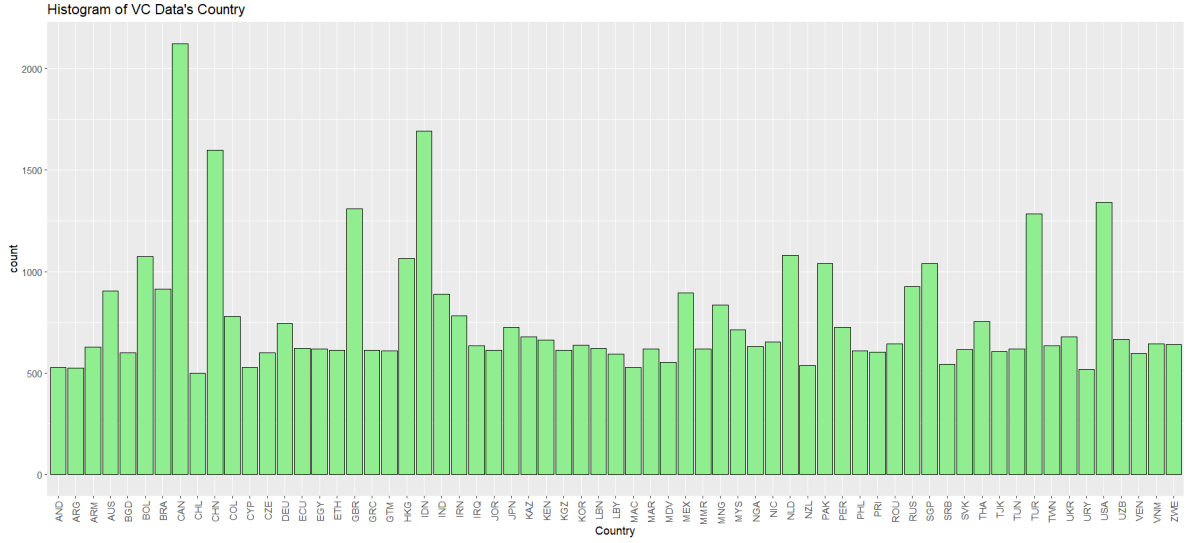


Figure 14: *Figure1a.4: Variety of Non-numerical Attribute (Country)*

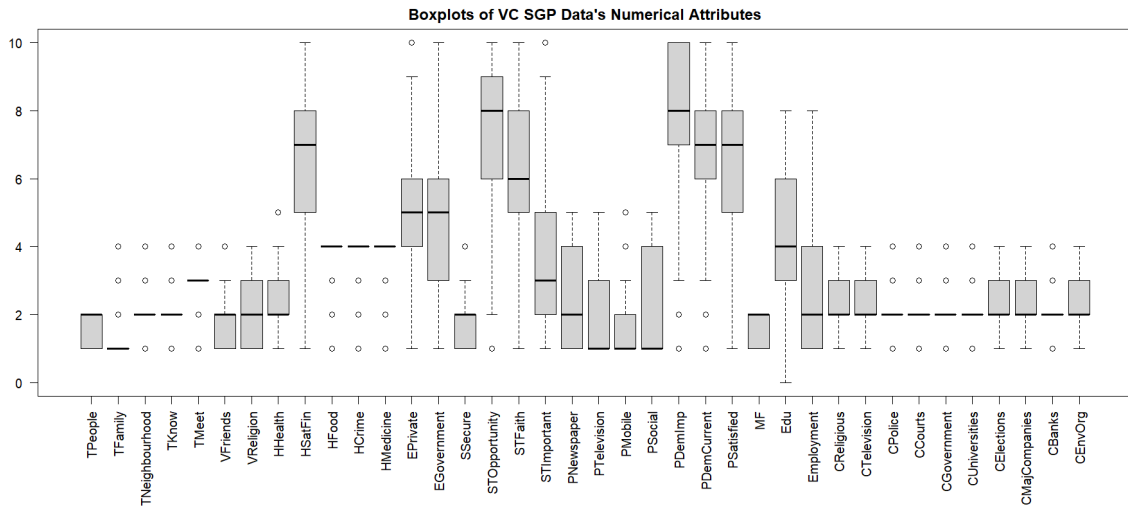


Figure 15: *Figure 2a.1: Distribution of Numerical Attributes for VC Focus Country (SGP) Data (Excluding 'Age' Attribute)*

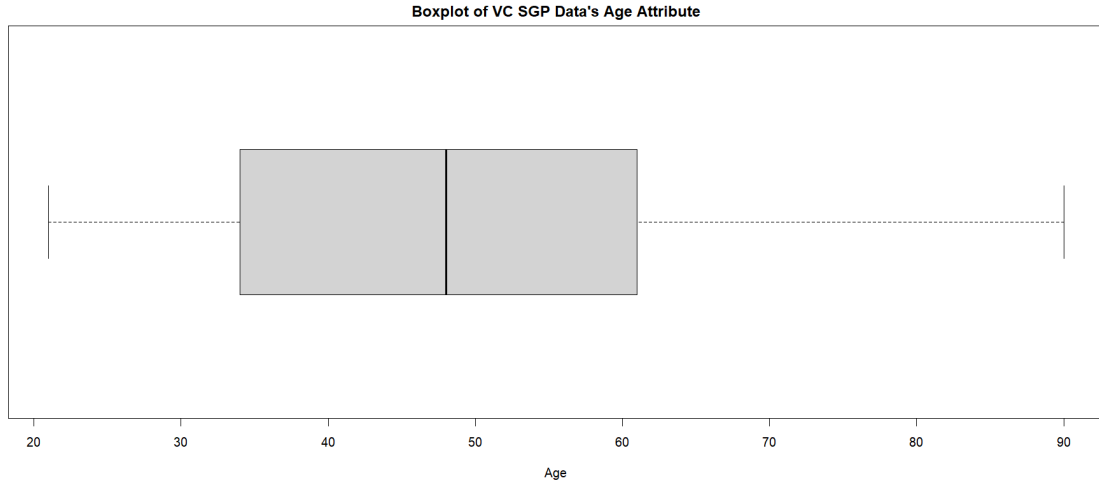


Figure 16: *Figure 2a.2: Distribution of Numerical Attribute (Age) for VC Focus Country (SGP) Data*

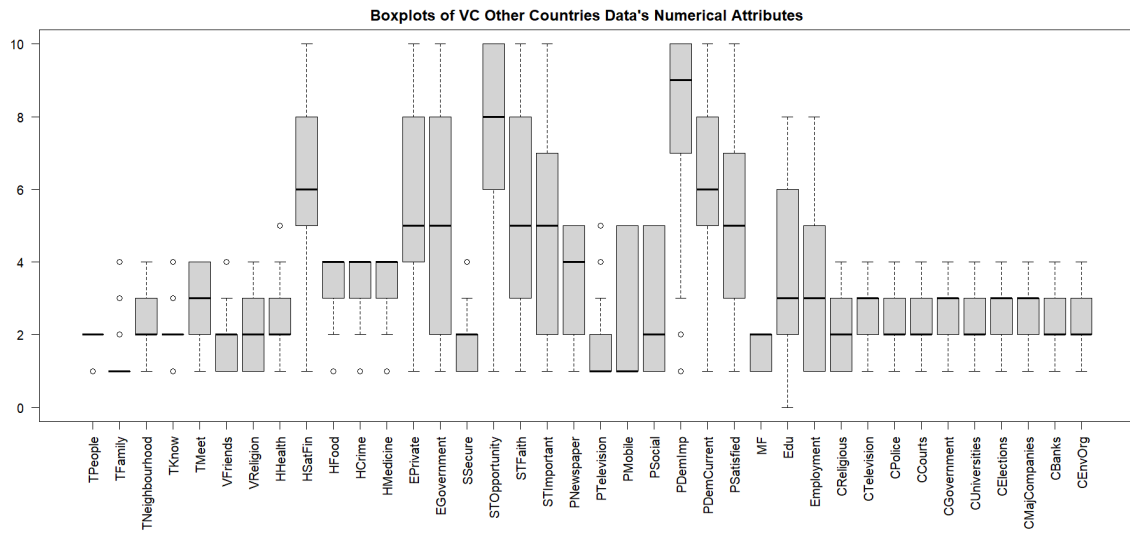


Figure 17: *Figure2a.3: Distribution of Numerical Attributes for VC Non-Focus Countries Data (Excluding 'Age' Attribute)*

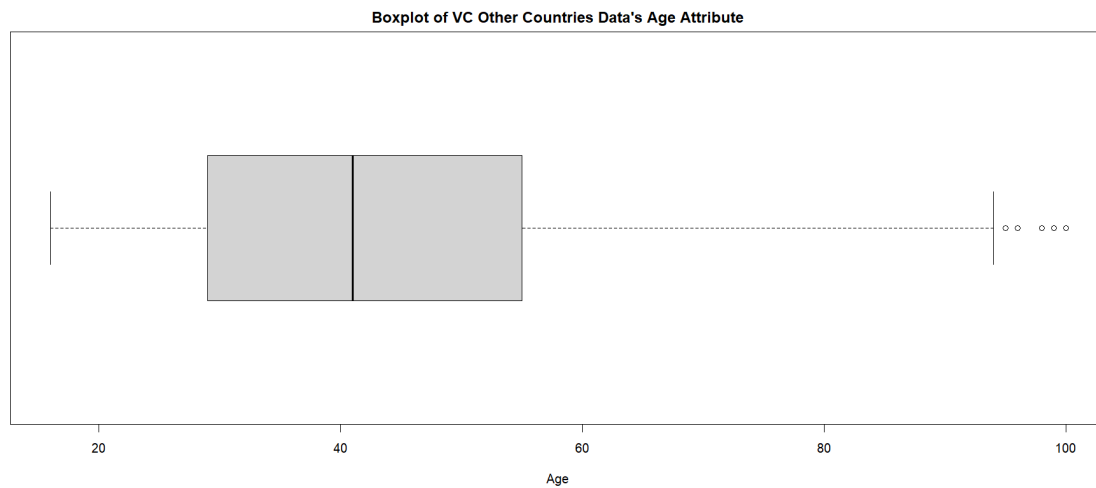


Figure 18: *Figure 2a.4: Distribution of Numerical Attribute (Age) for VC Non-Focus Countries Data*

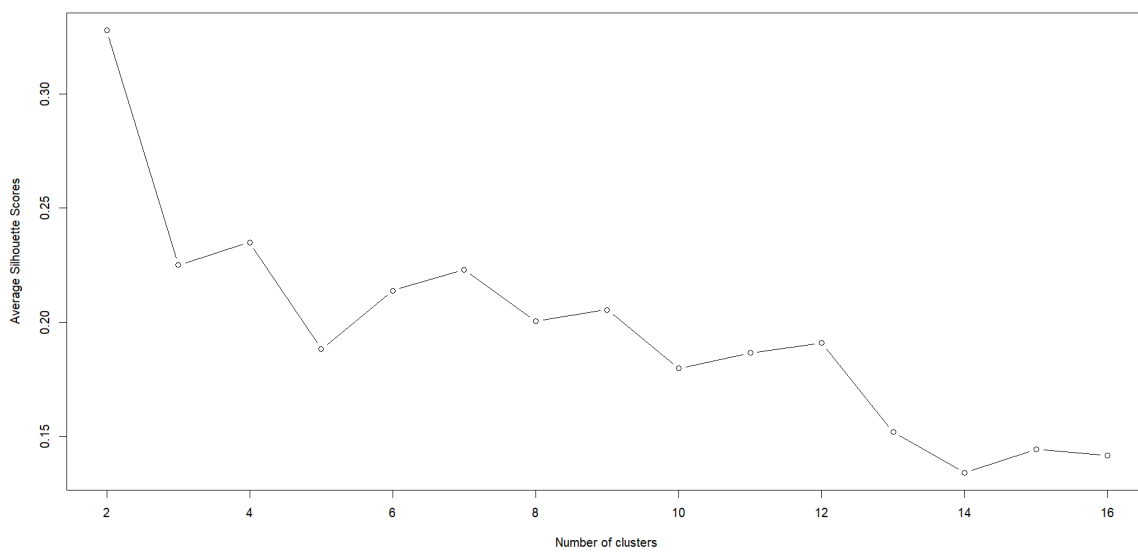


Figure 19: *Figure 3a.1: Average Silhouette Scores Against The Number of Clusters*

