DSC324/424

Assignment #2 (DUE SUNDAY, July 31st, 2022 by Midnight)

Deliverables: Turn in your answers in a single PDF file. Use KnitR or Copy any R output relevant to your answer into your Word document and explain your answer thoroughly and include a copy of the full analysis in your report along with your conclusions. Also, provide your R code files.

Problem 1 (10 points) Answer each of the following questions:

a) What are regularized regressions? What are the differences between ridge and lasso regressions?

Regularized regressions models are penalized to avoid overfitting. Ridge regression has a penalty that is equal to the sum of the squares of the coefficients. Lasso regression has a penalty equal to the sum of the absolute values of the coefficients.

b) What are some causes of overfitting? How do we diagnose and treat overfitting in regression models?

Overfitting can be caused by many things: (1) too many features, (2) too few data points, and (3) highly correlated features. To diagnose overfitting you look at training error and test error; the training error is much lower than the test error. There are a few ways to treat overfitting: (1) simplify the model, (2) increase the amount of data, and (3) reduce the number of features.

c) What is multicollinearity? How do we diagnose and treat multicollinearity in regression models?

Multicollinearity - when multiple features or variables are highly correlated. To diagnose multicollinearity, look at the correlation matrix and the variance inflation factor (VIF). To treat multicollinearity, remove one of the correlated features or use regularization.

Problem 2 (10 Points): Have 1 Group member post the answers to the below questions **to the final project forum under the discussion section of D2L**:

DONE

- Project Team: Group Members
- Data:
 - Subject Area or Field of Interest
 - Source of Data (provide link to data)
 - Specific dataset(s)
 - description of its scope (# metric variables, #categorical variables, #samples, multiple related tables?)
 - Technology group plans to use for Project (i.e. Python, R, SPSS, Tableau, etc.) How do you plan to use the technology?
 - In addition, as you are forming your groups, remember the following requirements for

datasets and groups:

- a. Your group should have 4-5 people in it.
- b. Please to make sure to have 1 liaison person for the group, who can submit assignments and ask me questions on behalf of the group.
- c. Your dataset should be a real and rich dataset with at least 15 to 20 variables metric (continuous). It should have at least (10 * #var, but better yet 20 * #var) samples (we will see that some techniques like PCA require this for significance/stability). You will need a large sample size if you have a large n umber of variables. See me if you have any doubts about your dataset.

Problem 3 (Paper review) (10 Points) An academic paper from a conference or Journal will be posted to the Homework 2 content section of D2L. Review the paper and evaluate their usage of Factor Analysis. In particular address the following: (See article on Psychological, social and economic impact of COVID 19 on the working population of India: Exploratory factor analysis approach)

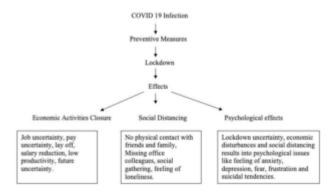
How are they applying Factoring Analysis?

They apply exploratory factoring analysis because there are no standard tools to measure psycho-social, economic, and work related issues caused due to the COVID-19 pandemic (4, 4.1 Preliminary analysis).

What kind of factor rotation do they use?

They are using the oblimin rotation method. On page 4 in section 4.1. Preliminary analysis states "Principal component analysis (PCA) and Oblique rotation (Direct Oblimin) are used, as the extraction and factor rotation method, as the items were not independent". Oblique rotation is the same as oblimin rotation.

 How many factors do they concentrate on in their analysis? How did they arrive at these number of factors?



There are three factors that are concentrated on in the analysis: (1) psychological effects, (2) social distancing and (3) economic activities closure. Social distance was derived

from Social identity theory. The psychological need theory or self-determination theory supports psychological effects. Lastly, economic activities closure was derived from the economic uncertainty principle.

• Explain the breakdown of the factors and the significance of their names.

Table 2
Values of communalities extraction and factor loading for psycho-social measures.

	Communalities	Component 1	Component 2
I'm worried about myself and my family members who may be reached by COVID-19.	0.72	0.85	
I'm worried about myself and my colleagues who may be reached by COVID-19.	0.69	0.85	
I see the possibility that COVID- 19 will break out in the area where I live and work.	0.56	0.75	
Uncertainty of the situation makes me feel worried about my family.	0.64	0.75	
Even after the lockdown period, I will avoid using public transport.	0.75		0.87
I will try to avoid social gatherings in the coming few months.	0.78		.088
I'm afraid of the uncertainty of the situation.	0.54		0.63
I freak out while going out for groceries.	0.58		0.71
I easily get irritated these days.	0.69		0.82

Table 3
Values of communalities extraction and factor loading for work-related Economic measures.

	Communalities	Component 1	Component 2	Component 3
I feel uncertain	0.75	0.86		
about the future of my job.				
I think my salary, bonus and other benefits will be reduced in the near future.	0.53	0.74		
My organization has assured the Employees regarding the regularity of salary.	0.61	0.48		
I feel that my organization will help its employees to attain financial stability.	0.62	0.57		
I'm doubtful about my future in this job.	0.77	0.88		
Work from home provides flexibility to some extent.	0.66		0.79	
Work from home helps in maintaining a balance between work and household chores.	0.78		0.88	
Work from home has decreased my productivity at work.	0.67		0.76	
I find it difficult to concentrate on work while working from home.	0.69		0.81	
Now I'm able to manage work and home easily.	0.54		0.48	
I think I will be able to continue working here.	0.64			0.71
Safety is given high priority by the management.	0.73			0.85
When COVID-19 broke out the company immediately established a pandemic prevention committee.	0.56			0.75
Management of my organization	0.65			0.61

	Communalities	Component 1	Component 2	Component 3
was neutral about the employees' safety at the time of the outbreak of COVID-19				
Work is given utmost priority in my organization even in the current situation.	0.56			0.37
Safety rules and procedures are strictly followed by the management.	0.65			0.80

Factors were further broken down into two factors: (1) psycho-social effects and (2) economic status.

• How do they evaluate the stability of the components (i.e. factorability)?

In the study they use the Bartlett's test and KMO measurements. "For psycho-social measures, the KMO value to check sampling adequacy was 0.713, and Bartlett's test value of sphericity was found significant at 0.01 levels" (4). "For measuring economic status and work-related, the KMO value to check sampling adequacy was 0.735, and Bartlett's test value of sphericity was significant at 0.01 levels" (4). However, there did not seem to be any reliability analysis.

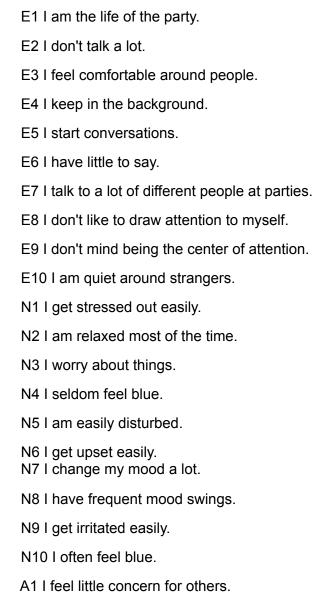
• Do they use these factors in later analysis, such as regression? If so, what do they discover?

In the study target use a one-way ANOVA test to draw later analysis. They find the tier 1 cities differ significantly between tier 2 and tier 3 cities. That being tier 2 and 3 are more financially stable than tier 1.

What overall conclusions does Factor Analysis allow them to draw?

The study finds that women are more socially vulnerable than men. Working individuals are among those who face the most severe repercussions. They also find that tier 1 cities differ significantly between tier 2 and tier 3 cities. That being tier 2 and 3 are more financially stable than tier 1. The overall conclusion they draw is that the Indian Government "has to take drastic measures, keeping in mind the overall behavioral, psycho-social, financial, and economic impact of the COVID19 pandemic" (6).

Problem 4 (Principal Component Analysis - 20 points): The data given in the file 'Big5.csv' are 5-point Likert items taken from the Big Five Personality Test web-based personality assessment. Techniques, such as Principal Component Analysis (PCA), can be used to determine different types of personalities. There are 19,719 subjects in the file and 50 variable items as follows:



A2 I am interested in people.

A4 I sympathize with others' feelings.

A3 I insult people.

I have a soft heart. A7 I am not really interested in others. A8 I take time out for others. A9 I feel others' emotions. A10 I make people feel at ease. C1 I am always prepared. C2 I leave my belongings around. C3 I pay attention to details. C4 I make a mess of things. C5 I get chores done right away. C6 I often forget to put things back in their proper place. C7 Llike order. C8 I shirk my duties. C9 I follow a schedule. C10 I am exacting in my work. O1 I have a rich vocabulary. O2 I have difficulty understanding abstract ideas. O3 I have a vivid imagination. O4 I am not interested in abstract ideas. O5 I have excellent ideas. O6 I do not have a good imagination. O7 I am quick to understand things. O8 I use difficult words.

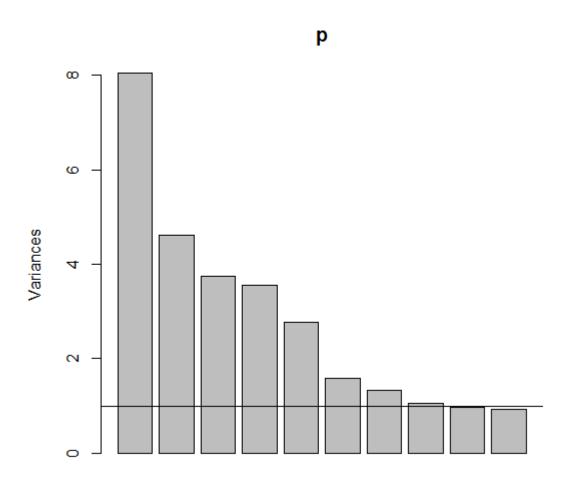
A5 I am not interested in other people's problems. A6

O9 I spend time reflecting on things.

O10 I am full of ideas.

A) How many components are needed to explain 100% of total variation for this data? How many components are determined from the scree plot? What number of components would you use in the model?

There are 50 components that are needed to 100% describe total variation. The scree plot determines there are 10 components. The model should only see about 3 or 4 components in the model.



B) For the number of components in part A, give the formula for each component and a brief interpretation after rotating the components. What names might you give for each of the components?

```
Loadings:
                  RC3
    RC1
           RC2
    0.645
E1
E2 -0.676
   0.674
E3
E4 -0.660
E5
   0.737
E6 -0.648
Ε7
    0.720
E8 -0.531
     0.602
E9
E10 -0.623
A2
   0.559
Α7
   -0.550
            0.687
N1
N3
            0.659
            0.545
Ν5
N6
            0.720
            0.651
N7
Ν8
            0.674
Ν9
            0.596
N10
            0.623
                   0.523
Α4
C4
            0.455 -0.501
C5
                   0.535
C8
                  -0.513
                   0.550
C9
N2
           -0.487
Ν4
Α1
Α3
                  -0.494
Α5
Аб
                   0.453
Α8
Α9
                   0.479
A10 0.481
                   0.494
C1
C2
                  -0.426
C3
C6
                  -0.488
C7
                   0.467
C10
                   0.429
01
02
03
04
05
06
07
08
09
010
```

RC1 RC2 RC3 SS loadings 6.611 5.244 4.557 Proportion Var 0.132 0.105 0.091 Cumulative Var 0.132 0.237 0.328 C) What subjects have the highest and lowest values for each principal component (only include the number of components specified in part A. For each of those subjects, give the principal component scores (again only for the number of components specified in part A).

RC1 - Highest: 2.845205 | Lowest: -3.801185

RC2 - Highest: 3.05435 | Lowest:-3.77084

RC3 - Highest: 3.31042 | Lowest: -4.84888

D) Finally, run a common factor analysis on the same data. What difference, if any, do you find? Does the factor analysis change your ability to interpret the results practically?

```
Loadings:
   Factor1 Factor2 Factor3
E1 0.670
E2 -0.686
E3 0.665
E4 -0.698
E5 0.744
E6 -0.605
   0.745
E7
E8 -0.553
E9
   0.615
E10 -0.655
             0.633
Ν1
             0.542
N3
             0.546
Ν5
             0.723
N6
N7
             0.736
Ν8
             0.764
Ν9
             0.673
N10
             0.624
C4
             0.509
Α4
                     0.767
Α5
                    -0.608
А6
                    0.593
Α7
   -0.377
                    -0.555
Α8
                     0.572
                     0.704
Α9
            -0.450
N2
            -0.328
Ν4
Α1
                    -0.408
A2
     0.404
                     0.482
Α3
                    -0.416
A10 0.375
                     0.382
C1
C2
C3
C5
С6
             0.338
C7
C8
             0.364
C9
C10
01
02
03
04
05
06
07
08
09
010
               Factor1 Factor2 Factor3
SS loadings
                5.462 5.077 3.765
               0.109
                        0.102
```

Proportion Var

Cumulative Var

0.075

0.286

0.211

0.109

When running a factor analysis you find that most of the data is the same based on the rotation of the components in previous questions. There still needs to be variables removed like in the rotation. This will be taken care of in further iterations of the work.