Remzi Meri? Ceylan

May 16, 2018

1 Veri Madencilii Ödevi - Bahar 2018

2	Remzi	Meriç	Cey	lan
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2.1 1.Özet

Projenin temel ksmlar, veri tanmlama, algoritma tantm ve modellemesi yapld,. Veri katagorik olduu için gruplama yapmakta zorlanld ve parametre seçimi, yorumlama yaplamad.

2.2 2.Giri

```
In [1]: import numpy as np
        import pandas as pd
        from sklearn.cluster import KMeans, DBSCAN, AgglomerativeClustering
        from IPython.display import Math, Latex
        import matplotlib.pyplot as plt
        from IPython.display import display
        pd.options.display.max_columns = None
In [2]: flags = pd.read_csv("flags.csv", header=None)
        flags.columns = list(range(1,31))
        flags.index = flags[1]
        del flags[1]
        flags.head(10)
Out [2]:
                                               7
                                                           10
                                                               11
                                                                   12
                                                                       13 14
                                                                               15 16 \
        Afghanistan
                          5
                                  648
                                       16
                                          10
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        Albania
                                   29
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                                                        0
                                                            3
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                          3
                             1
                                            6
                                                6
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                                                                                0
                                                                                    1
        Algeria
                                2388
                                       20
                                           8
                                                        0
                                                            3
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                                                                            0
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                                                                                1
        American-Samoa
                          6 3
                                   0
                                       0
                                                            5
                                                1
                                                   0
                                                       0
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                                                                            1
        Andorra
                          3 1
                                   0
                                       0
                                                  3
                                                            3
                                                                    0
                                                                                0
                                                                                    0
                          4 2 1247
                                       7 10
                                                            3
        Angola
                                                                    0 0 1
                                                                                    1
        Anguilla
```

```
Antigua-Barbuda
                            2
                                3
                                   2777
                                          28
                                               2
                                                    0
                                                        0
                                                            3
                                                                 2
                                                                     0
                                                                         0
                                                                              1
                                                                                  0
                                                                                           0
        Argentina
                                                                                      1
                            2
                                3
                                  2777
                                          28
                                                    0
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                                                            3
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        Argentine
                                                                                  1
                                                                                      1
                                           20
                                               21
                                                    22
                                                        23
                                                            24
                                                                 25
                                                                     26
                                                                         27
                                                                              28
                           17
                                  18
                                      19
                                                                                     29
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        Afghanistan
                            0
                               green
                                        0
                                            0
                                                0
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                                                         1
                                                             0
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                                                                      1
                                                                          0
                                                                               0
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        Albania
                            0
                                 red
                                        0
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                                                         1
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                                                                  0
                                                                      0
                                                                          1
                                                                               0
                                                                                    red
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                                                     0
                                                         1
                                                             1
                                                                  0
                                                                      0
                                                                          0
        Algeria
                            0
                               green
                                                                               0
                                                                                  green
        American-Samoa
                            1
                                blue
                                        0
                                            0
                                                0
                                                     0
                                                         0
                                                             0
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                                                                          1
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                                                                                   blue
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        Andorra
                            0
                                gold
                                                                               0
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                                        0
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                                                0
                                                     0
                                                         1
                                                             0
                                                                  0
                                                                          0
        Angola
                            0
                                 red
                                                                      1
                                                                                    red
                                                0
                                                     0
                                                             0
                                                                          1
                            1
                              white
                                        0
                                            0
                                                         0
                                                                  0
                                                                      0
                                                                                  white
        Anguilla
                                        0
                                            0
                                                0
                                                     0
                                                         1
                                                             0
                                                                 1
                                                                      0
                                                                          0
                                                                                  black
        Antigua-Barbuda
                            0
                                 red
                            0
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                                                0
                                                     0
                                                         0
                                                             0
                                                                  0
                                                                      0
                                                                          0
        Argentina
                                blue
                                        0
                                                                                   blue
                                                0
                                                         1
                                                                  0
                                                                          0
                                blue
                                        0
                                                                                   blue
        Argentine
                              30
        1
        Afghanistan
                           green
        Albania
                             red
        Algeria
                           white
        American-Samoa
                             red
        Andorra
                             red
        Angola
                           black
        Anguilla
                            blue
                             red
        Antigua-Barbuda
        Argentina
                            blue
        Argentine
                            blue
In [3]: def enumerate_dataframe(df):
             for column in df:
                 if type(df[column][0]) == np.int64:
                     pass
                 else:
                     print("Column Name: ",df[column].name)
                     print(df[column].unique())
                     key=[]
                     value=[]
                     for v, k in enumerate(df[column].unique()):
                          key.append(k)
                          value.append(v)
                          print(k, "\t", v)
                     print("\n")
                     df[column] = df[column].map(dict(zip(key, value)))
             return df
In [4]: flags = enumerate_dataframe(flags)
```

```
Column Name: 18
['green' 'red' 'blue' 'gold' 'white' 'orange' 'black' 'brown']
green
               0
red
             1
blue
              2
              3
gold
               4
white
                5
orange
black
brown
               7
Column Name:
              29
['black' 'red' 'green' 'blue' 'white' 'orange' 'gold']
black
red
             1
green
               2
blue
              3
white
               4
                5
orange
              6
gold
Column Name: 30
['green' 'red' 'white' 'black' 'blue' 'gold' 'orange' 'brown']
green
               0
red
             1
               2
white
black
               3
blue
              4
              5
gold
orange
               6
brown
In [5]: flags.columns = [
        "landmass",
        "zone",
        "area_km2",
        "population",
        "language",
        "religion",
        "bars_count",
        "stripes_count",
        "colours_count",
        "red_exist",
```

```
"blue_exist",
        "gold_yellow_exist",
        "white_exist",
        "black_exist",
        "orange_brown_exist",
        "mainhue_predominant_colour",
        "circles_count",
        "crosses_count",
        "saltires_count",
        "quarters_count",
        "sunstars_count",
        "crescent_exist",
        "triangle_exist",
        "icon_exist",
        "animate_exist",
        "text_exist",
        "topleft_colour",
        "botleft_colour"
        1
        flags.index.name = "country_name"
In [6]: """
                                    -> 1=N.America, 2=S.America, 3=Europe, 4=Africa, 5=Asia, 6=Oc
        landmass
                                    -> 1=NE, 2=SE, 3=SW, 4=NW
        zone
                                    -> 1=English, 2=Spanish, 3=French, 4=German, 5=Slavic, 6=Othe
        language
                                    9=Japanese/Turkish/Finnish/Magyar, 10=Others
        religion
                                    -> O=Catholic, 1=Other Christian, 2=Muslim, 3=Buddhist, 4=Him
        mainhue_predominant_colour -> green=0, red=1, blue=2, gold=3, white=4, orange=5, black=6
                                    -> black=0, red=1, green=2, blue=3, white=4, orange=5, gold=6
        topleft colour
        botleft\_colour
                                    -> green=0, red=1, white=2, black=3, blue=4, gold=5, orange=6
        flags.head(10)
Out[6]:
                          landmass
                                    zone
                                         area_km2 population language religion \
        country_name
                                                                                   2
        Afghanistan
                                 5
                                       1
                                                648
                                                             16
                                                                        10
        Albania
                                 3
                                                 29
                                                              3
                                                                         6
                                                                                   6
                                 4
                                       1
                                               2388
                                                             20
                                                                         8
                                                                                   2
        Algeria
        American-Samoa
                                 6
                                       3
                                                  0
                                                              0
                                                                         1
                                                                                   1
                                 3
                                       1
                                                  0
                                                              0
                                                                         6
                                                                                   0
        Andorra
                                 4
                                       2
                                               1247
                                                              7
                                                                        10
                                                                                   5
        Angola
                                 1
                                       4
                                                  0
                                                              0
                                                                         1
                                                                                   1
        Anguilla
                                 1
                                       4
                                                  0
                                                              0
                                                                         1
                                                                                   1
        Antigua-Barbuda
        Argentina
                                 2
                                       3
                                               2777
                                                             28
                                                                         2
                                                                                   0
                                 2
                                       3
        Argentine
                                               2777
                                                             28
                                                                         2
                                                                                   0
```

"green_exist",

	bars_count s	tripes_count co	lours_count red	$l_{ m exist}$ \		
country_name		_				
Afghanistan	0	3	5	1		
Albania	0	0	3	1		
Algeria	2	0	3	1		
American-Samoa	0	0	5	1		
Andorra	3	0	3	1		
Angola	0	2	3	1		
Anguilla	0	1	3	0		
Antigua-Barbuda	0	1	5	1		
Argentina	0	3	2	0		
Argentine	0	3	3	0		
	green_exist	blue_exist gold	_yellow_exist v	hite_exist \		
country_name						
Afghanistan	1	0	1	1		
Albania	0	0	1	0		
Algeria	1	0	0	1		
American-Samoa	0	1	1	1		
Andorra	0	1	1	0		
Angola	0	0	1	0		
Anguilla	0	1	0	1		
Antigua-Barbuda	0	1	1	1		
Argentina	0	1	0	1		
Argentine	0	1	1	1		
	black_exist orange_brown_exist mainhue_predominant_colour \					
	black_exist	orange_brown_exi	st mainhue_pred	$lominant_colour \setminus$		
country_name	black_exist	orange_brown_exi	st mainhue_pred	dominant_colour \		
country_name Afghanistan	black_exist	orange_brown_exi	st mainhue_pred	dominant_colour \ 0		
•		orange_brown_exi	_			
Afghanistan	1	orange_brown_exi	0	0		
Afghanistan Albania	1 1	orange_brown_exi	0 0	0 1	•	
Afghanistan Albania Algeria	1 1 0	orange_brown_exi	0 0 0	0 1 0		
Afghanistan Albania Algeria American-Samoa	1 1 0 0	orange_brown_exi	0 0 0 1	0 1 0 2		
Afghanistan Albania Algeria American-Samoa Andorra	1 1 0 0	orange_brown_exi	0 0 0 1 0	0 1 0 2 3	•	
Afghanistan Albania Algeria American-Samoa Andorra Angola	1 1 0 0 0	orange_brown_exi	0 0 0 1 0	0 1 0 2 3 1		
Afghanistan Albania Algeria American-Samoa Andorra Angola Anguilla Antigua-Barbuda	1 1 0 0 0 1	orange_brown_exi	0 0 0 1 0 0	0 1 0 2 3 1 4		
Afghanistan Albania Algeria American-Samoa Andorra Angola Anguilla	1 1 0 0 0 1 0	orange_brown_exi	0 0 0 1 0 0 1	0 1 0 2 3 1 4		
Afghanistan Albania Algeria American-Samoa Andorra Angola Anguilla Antigua-Barbuda Argentina	1 1 0 0 0 1 0 1 0		0 0 0 1 0 0 1 0 0	0 1 0 2 3 1 4 1 2 2		
Afghanistan Albania Algeria American-Samoa Andorra Angola Anguilla Antigua-Barbuda Argentina Argentine	1 1 0 0 0 1 0 1		0 0 0 1 0 0 1 0	0 1 0 2 3 1 4 1 2	`	
Afghanistan Albania Algeria American-Samoa Andorra Angola Anguilla Antigua-Barbuda Argentina Argentine country_name	1 1 0 0 0 1 0 1 0 0	crosses_count	0 0 0 1 0 0 1 0 0 0 0 0 saltires_count	0 1 0 2 3 1 4 1 2 2 quarters_count	`	
Afghanistan Albania Algeria American-Samoa Andorra Angola Anguilla Antigua-Barbuda Argentina Argentine country_name Afghanistan	1 1 0 0 0 1 0 1 0 0 circles_count	crosses_count	0 0 0 1 0 0 1 0 0 0 0 0 saltires_count	0 1 0 2 3 1 4 1 2 2 2 quarters_count	`	
Afghanistan Albania Algeria American-Samoa Andorra Angola Anguilla Antigua-Barbuda Argentina Argentine country_name Afghanistan Albania	1 1 0 0 0 1 0 1 0 0 circles_count	crosses_count 0 0	0 0 0 1 0 0 1 0 0 0 0 0 saltires_count	0 1 0 2 3 1 4 1 2 2 2 quarters_count	`	
Afghanistan Albania Algeria American-Samoa Andorra Angola Anguilla Antigua-Barbuda Argentina Argentine country_name Afghanistan Albania Algeria	1 1 0 0 0 1 0 1 0 0 circles_count	crosses_count 0 0 0	0 0 0 1 0 0 1 0 0 0 0 saltires_count	0 1 0 2 3 1 4 1 2 2 2 quarters_count	`	
Afghanistan Albania Algeria American-Samoa Andorra Angola Anguilla Antigua-Barbuda Argentina Argentine country_name Afghanistan Albania Algeria American-Samoa	1 1 0 0 0 1 0 1 0 0 circles_count	crosses_count 0 0 0 0	0 0 0 1 0 0 1 0 0 0 0 0 saltires_count	0 1 0 2 3 1 4 1 2 2 2 quarters_count	`	
Afghanistan Albania Algeria American-Samoa Andorra Angola Anguilla Antigua-Barbuda Argentina Argentine country_name Afghanistan Albania Algeria American-Samoa Andorra	1 1 0 0 0 1 0 1 0 0 0 circles_count	crosses_count 0 0 0 0 0 0	0 0 0 1 0 0 1 0 0 0 0 saltires_count	0 1 0 2 3 1 4 1 2 2 2 quarters_count	`	
Afghanistan Albania Algeria American-Samoa Andorra Angola Anguilla Antigua-Barbuda Argentina Argentine country_name Afghanistan Albania Algeria American-Samoa Andorra Angola	1 1 0 0 0 1 0 1 0 0 0 circles_count	crosses_count 0 0 0 0 0 0 0	0 0 0 1 0 0 1 0 0 0 0 saltires_count 0 0 0	0 1 0 2 3 1 4 1 2 2 2 quarters_count 0 0 0	`	
Afghanistan Albania Algeria American-Samoa Andorra Angola Anguilla Antigua-Barbuda Argentina Argentine country_name Afghanistan Albania Algeria American-Samoa Andorra	1 1 0 0 0 1 0 1 0 0 0 circles_count	crosses_count 0 0 0 0 0 0 0	0 0 0 1 0 0 1 0 0 0 0 0 saltires_count 0 0 0	0 1 0 2 3 1 4 1 2 2 2 quarters_count 0 0 0	`	

Antigua-Barbuda	0		0	0		0
Argentina	0		0	0		0
Argentine	0		0	0		0
	sunstars_count	crescent_e	xist triangl	_e_exist	icon_exist	\
country_name						
Afghanistan	1		0	0	1	
Albania	1		0	0	0	
Algeria	1		1	0	0	
American-Samoa	0		0	1	1	
Andorra	0		0	0	0	
Angola	1		0	0	1	
Anguilla	0		0	0	0	
Antigua-Barbuda	1		0	1	0	
Argentina	0		0	0	0	
Argentine	1		0	0	0	
	animate_exist	text_exist	topleft_cold	our botle	ft_colour	
country_name						
Afghanistan	0	0		0	0	
Albania	1	0		1	1	
Algeria	0	0		2	2	
American-Samoa	1	0		3	1	
Andorra	0	0		3	1	
Angola	0	0		1	3	
Anguilla	1	0		4	4	
Antigua-Barbuda	0	0		0	1	
Argentina	0	0		3	4	
Argentine	0	0		3	4	

2.3 3. Verinin Tanm

Title: Flag database

Source Information -- Creators: Collected primarily from the "Collins Gem Guide to Flags": Collins Publishers (1986). -- Donor: Richard S. Forsyth 8 Grosvenor Avenue Mapperley Park Nottingham NG3 5DX 0602-621676 -- Date: 5/15/1990

Past Usage: -- None known other than what is shown in Forsyth's PC/BEAGLE User's Guide. Relevant Information: -- This data file contains details of various nations and their flags. In this file the fields are separated by spaces (not commas). With this data you can try things like predicting the religion of a country from its size and the colours in its flag.

-- 10 attributes are numeric-valued. The remainder are either Boolean- or nominal-valued.

Number of Instances: 194

Number of attributes: 30 (overall)

Attribute Information:

- 1. name Name of the country concerned
- 2. landmass 1=N.America, 2=S.America, 3=Europe, 4=Africa, 5=Asia, 6=Oceania
- 3. zone Geographic quadrant, based on Greenwich and the Equator 1=NE, 2=SE, 3=SW, 4=NW

- 4. area in thousands of square km
- 5. population in round millions
- 6. language 1=English, 2=Spanish, 3=French, 4=German, 5=Slavic, 6=Other Indo-European, 7=Chinese, 8=Arabic, 9=Japanese/Turkish/Finnish/Magyar, 10=Others
- 7. religion 0=Catholic, 1=Other Christian, 2=Muslim, 3=Buddhist, 4=Hindu, 5=Ethnic, 6=Marxist, 7=Others
- 8. bars Number of vertical bars in the flag
- 9. stripes Number of horizontal stripes in the flag
- 10. colours Number of different colours in the flag
- 11. red 0 if red absent, 1 if red present in the flag
- 12. green same for green
- 13. blue same for blue
- 14. gold same for gold (also yellow)
- 15. white same for white
- 16. black same for black
- 17. orange same for orange (also brown)
- 18. mainhue predominant colour in the flag (tie-breaks decided by taking the topmost hue, if that fails then the most central hue, and if that fails the leftmost hue) (green=0, red=1, blue=2, gold=3, white=4, orange=5, black=6, brown=7)
- 19. circles Number of circles in the flag
- 20. crosses Number of (upright) crosses
- 21. saltires Number of diagonal crosses
- 22. quarters Number of quartered sections
- 23. sunstars Number of sun or star symbols
- 24. crescent 1 if a crescent moon symbol present, else 0
- 25. triangle 1 if any triangles present, 0 otherwise
- 26. icon 1 if an inanimate image present (e.g., a boat), otherwise 0
- 27. animate 1 if an animate image (e.g., an eagle, a tree, a human hand) present, 0 otherwise
- 28. text 1 if any letters or writing on the flag (e.g., a motto or slogan), 0 otherwise
- 29. topleft colour in the top-left corner (moving right to decide tie-breaks) (black=0, red=1, green=2, blue=3, white=4, orange=5, gold=6)
- 30. botright Colour in the bottom-left corner (moving left to decide tie-breaks) (green=0, red=1, white=2, black=3, blue=4, gold=5, orange=6, brown=7)

Missing values: None

""" 1. country_name 2. landmass 3. zone 4. area_km2 5. population 6. language 7. religion 8. bars_count 9. stripes_count 10. colours_count 11. red_exist 12. green_exist 13. blue_exist 14. gold_yellow_exist 15. white_exist 16. black_exist 17. orange_brown_exist 18. main-hue_predominant_colour 19. circles_count 20. crosses_count 21. saltires_count 22. quarters_count 23. sunstars_count 24. crescent_exist 25. triangle_exist 26. icon_exist 27. animate_exist

28. text exist 29. topleft colour

30. botleft colour """

2.4 4.Yöntemler

2.4.1 4.1 KMeans

The KMeans algorithm clusters data by trying to separate samples in n groups of equal variance, minimizing a criterion known as the inertia or within-cluster sum-of-squares. This algorithm