



1

About me

Academic



STEM

Professional



Data Science

Personal



World traveler

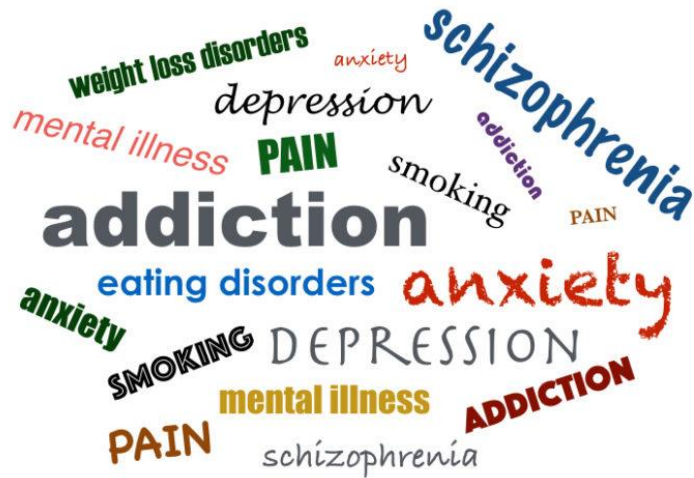
Content



1. Business Problem Overview

Background

A billion people **14%** of the world's population



Mental disorder

After covid-19

anxiety and depressive disorders



25%

1. Business Problem Overview

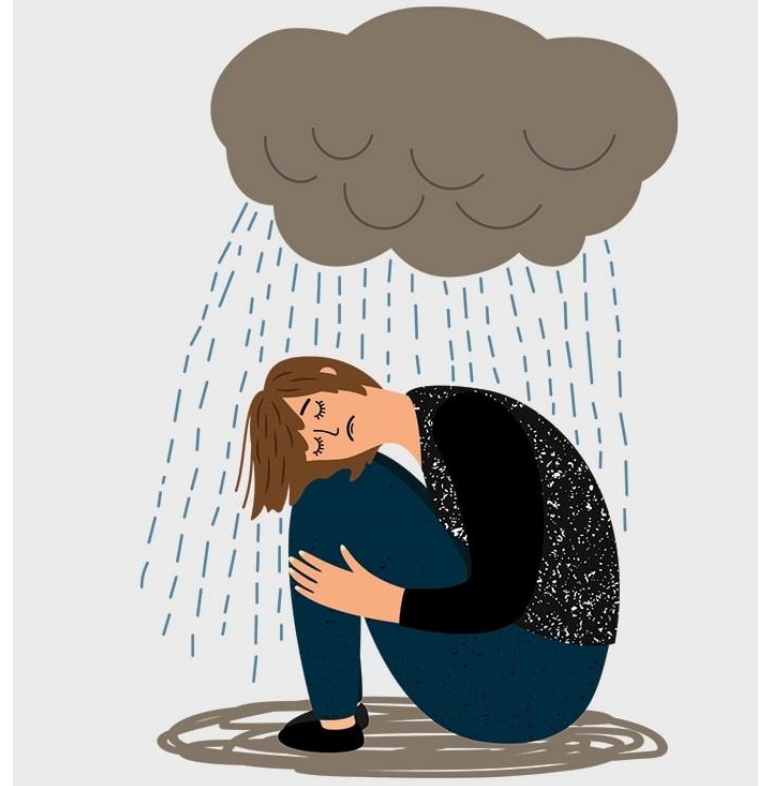
Background

The market is attractive:

- Global market size: **US\$ 527.44** billion by 2030
- Tech companies are willing to invest in EDI (Equity, diversity, and inclusion)
- People in Tech can afford the mental health care

Market status:

- This is an emerging industry
- Blue Ocean



1. Business Problem Overview

Executive summary

Problem:

How to improve the mental health status of different segmentations of the population



2. Dataset Overview

Data Source:

kaggle



Name: Mental Health in Tech Survey(2014)

Shape: (1259, 27)

Columns & Questions

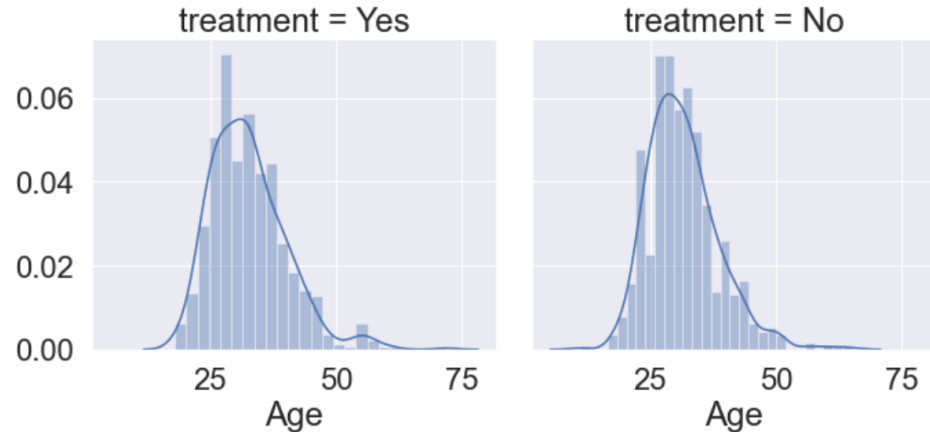
0. Timestamp
1. Age
2. Gender
3. Country
4. **state**: If you live in the United States, which state or territory do you live in?
5. **self_employed**: Are you self-employed?
6. **family_history**: Do you have a family history of mental illness?
7. **treatment**: Have you sought treatment for a mental health condition?
8. **work_interfere**: If you have a mental health condition, do you feel that it interferes with your work?
9. **no_employees**: How many employees does your company or organization have?
10. **remote_work**: Do you work remotely (outside of an office) at least 50% of the time?
11. **tech_company**: Is your employer primarily a tech company/organization?
12. **benefits**: Does your employer provide mental health benefits?
13. **care_options**: Do you know the options for mental health care your employer provides?
14. **wellness_program**: Has your employer ever discussed mental health as part of an employee wellness program?
15. **seek_help**: Does your employer provide resources to learn more about mental health issues and how to seek help?
16. **anonymity**: Is your anonymity protected if you choose to take advantage of mental health or substance abuse treatment resources?
17. **leave**: How easy is it for you to take medical leave for a mental health condition?
18. **mentalhealthconsequence**: Do you think that discussing a mental health issue with your employer would have negative consequences?
19. **physhealthconsequence**: Do you think that discussing a physical health issue with your employer would have negative consequences?
20. **coworkers**: Would you be willing to discuss a mental health issue with your coworkers?
21. **supervisor**: Would you be willing to discuss a mental health issue with your direct supervisor(s)?
22. **mentalhealthinterview**: Would you bring up a mental health issue with a potential employer in an interview?
23. **physhealthinterview**: Would you bring up a physical health issue with a potential employer in an interview?
24. **mentalvsphysical**: Do you feel that your employer takes mental health as seriously as physical health?
25. **obs_consequence**: Have you heard of or observed negative consequences for coworkers with mental health conditions in your workplace?
26. **comments**: Any additional notes or comments

3. Exploratory Data Analysis (EDA)

Data Cleaning

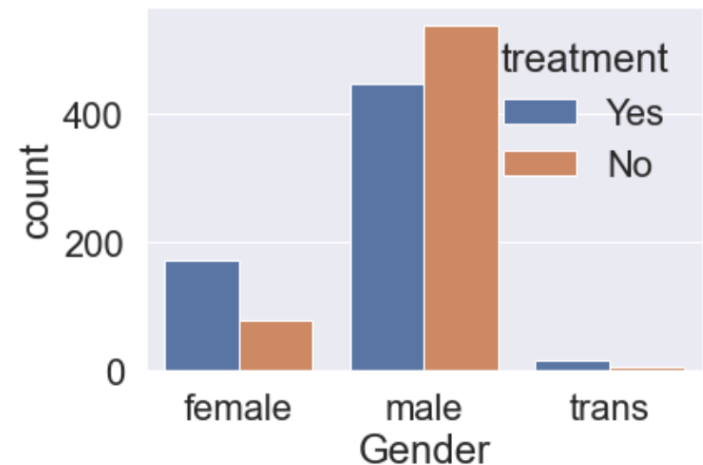
Without cleaning, the data will introduce noise in the model

Remove error



Cleaning categorical data

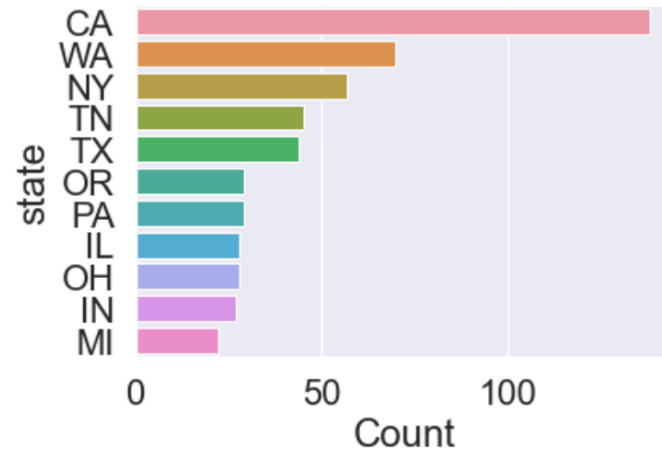
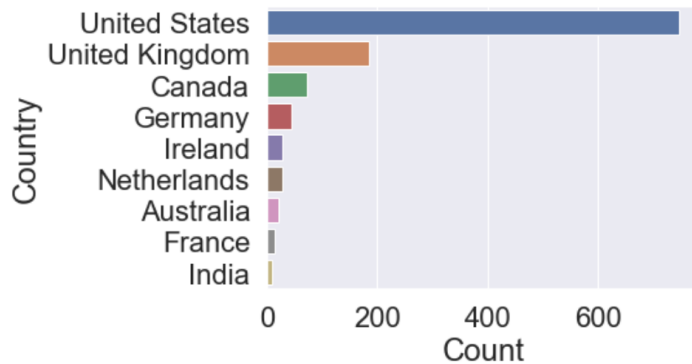
```
array(['female', 'm', 'male', 'male-ish', 'maile', 'trans-female',  
      'cis female', 'f', 'something kinda male?', 'cis male', 'woman',  
      'mal', 'male (cis)', 'queer/she/they', 'non-binary', 'femake',  
      'make', 'nah', 'enby', 'fluid', 'genderqueer', 'female ',  
      'androgyn', 'agender', 'cis-female/femme', 'guy (-ish) ^_^',  
      'male leaning androgynous', 'male ', 'man', 'trans woman', 'msle',  
      'neuter', 'female (trans)', 'queer', 'female (cis)', 'mail',  
      'malr', 'femall', 'cis man',  
      'ostensibly male, unsure what that really means'], dtype=object)
```



3. Exploratory Data Analysis (EDA)

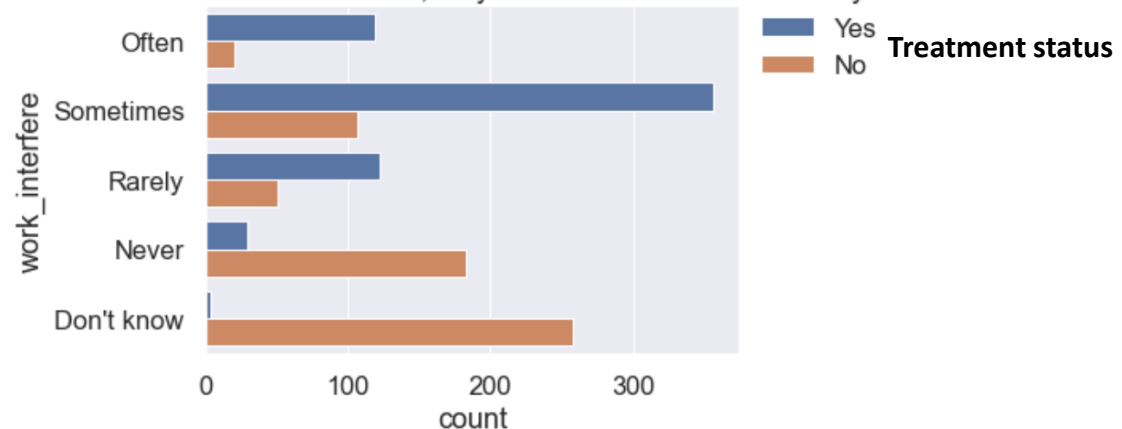
Data Cleaning

Remove redundant features



Filling the hole

If you have a mental health condition, do you feel that it interferes with your work?

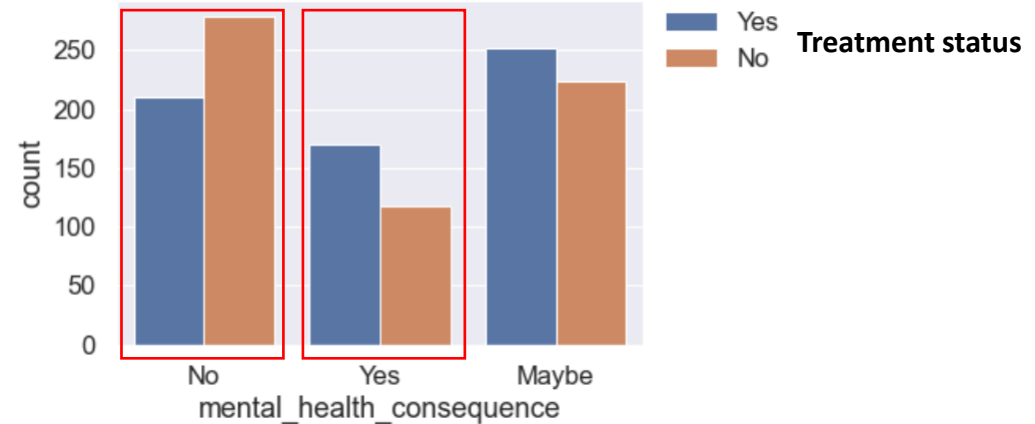


3. Exploratory Data Analysis (EDA)

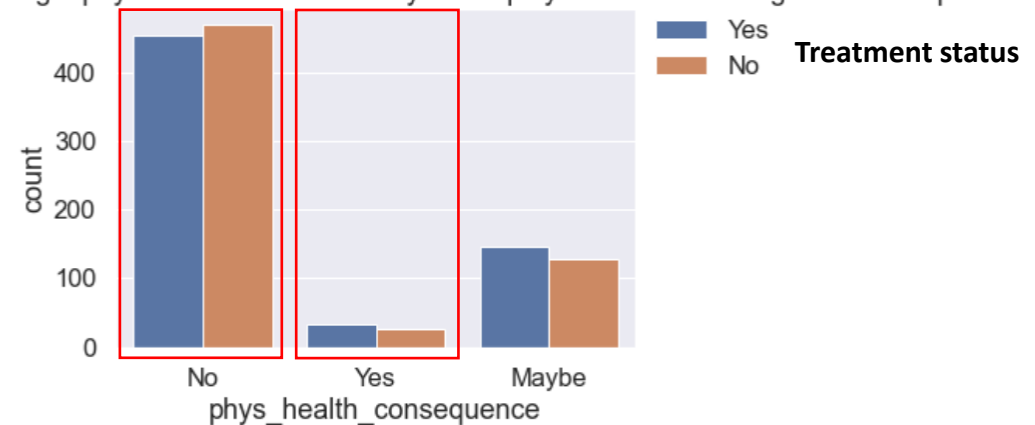
Data visualization

Mental health issues impact career development more than physical health issues

Do you think that discussing a mental health issue with your employer would have negative consequences?



Do you think that discussing a physical health issue with your employer would have negative consequences?



3. Exploratory Data Analysis (EDA)

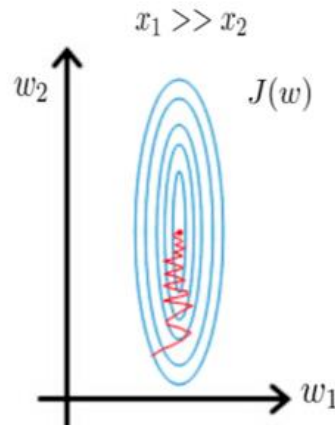
Feature engineering

- Translate Categories to Numerical Variables

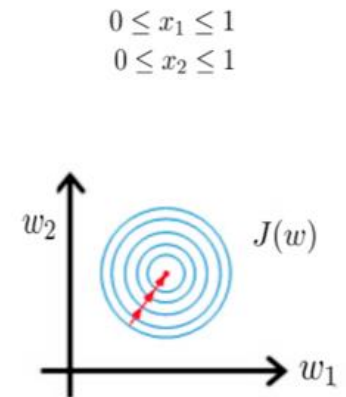
Original Encoding	Ordinal Encoding
Poor	1
Good	2
Very Good	3
Excellent	4

- Scaling

Gradient descent
without scaling

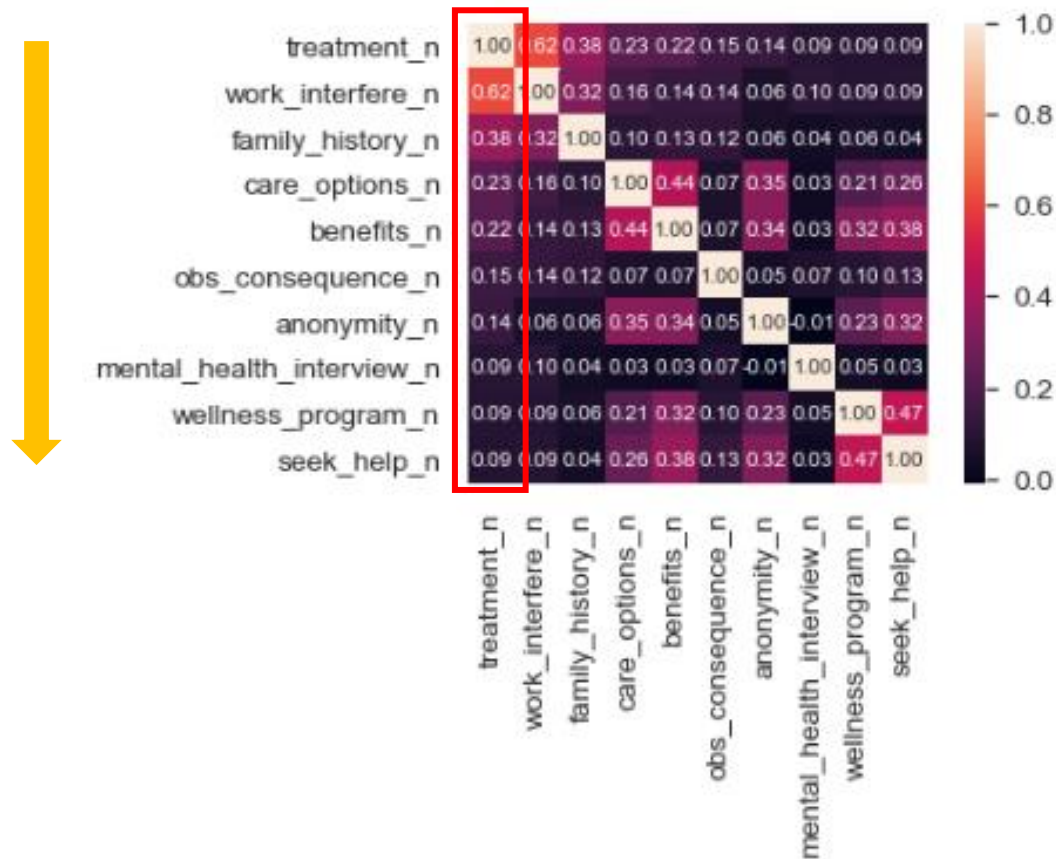


Gradient descent
after scaling variables



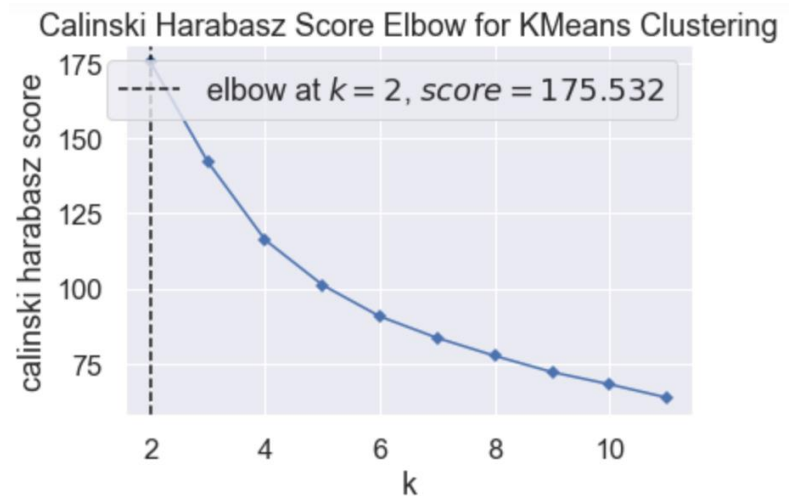
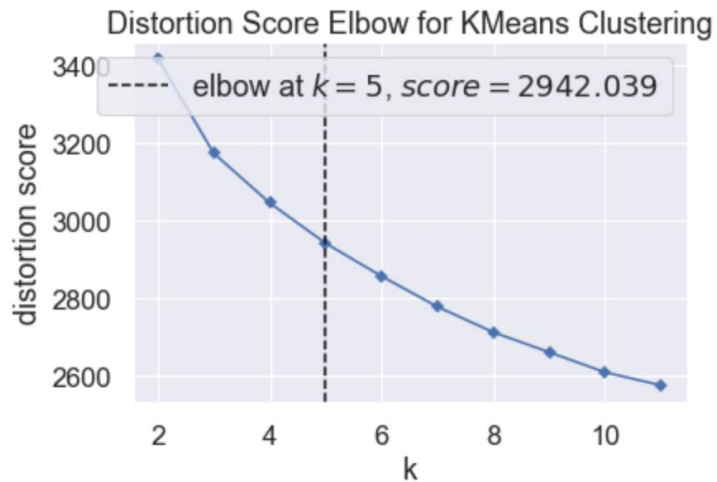
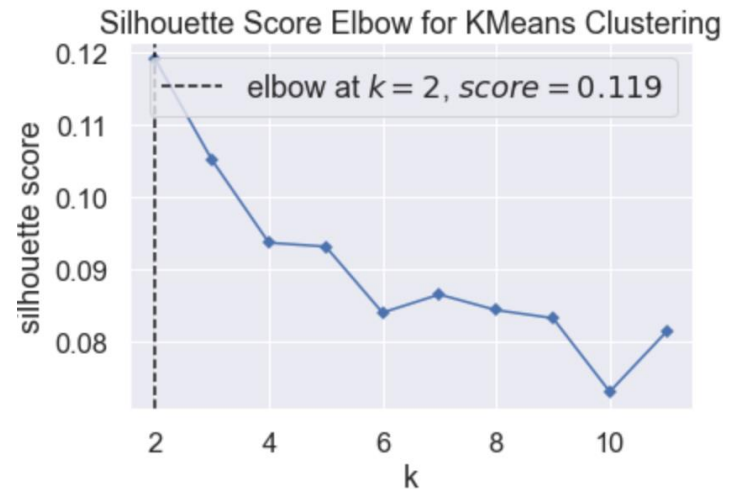
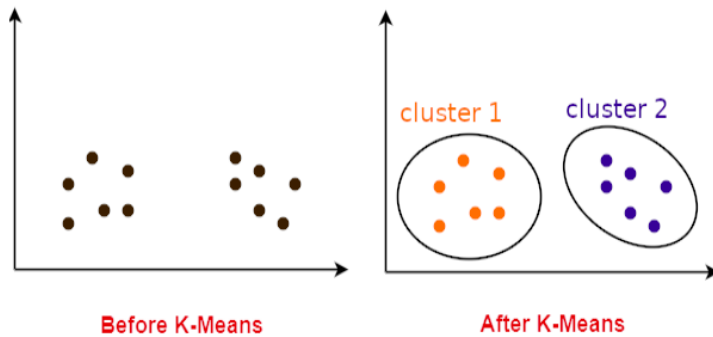
3. Exploratory Data Analysis (EDA)

Correlation matrix



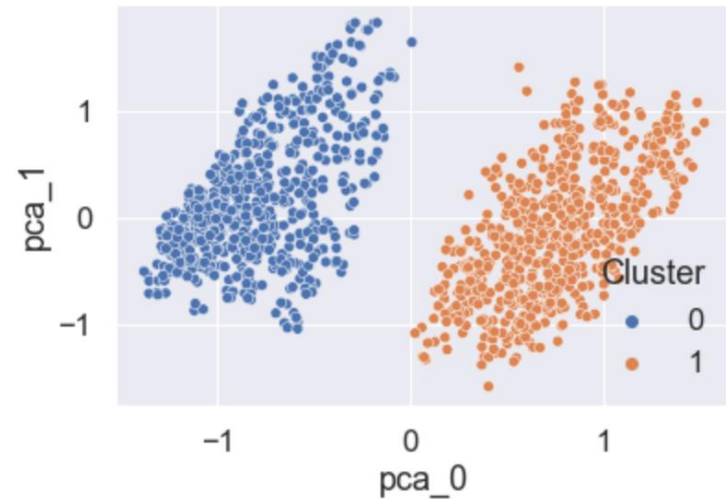
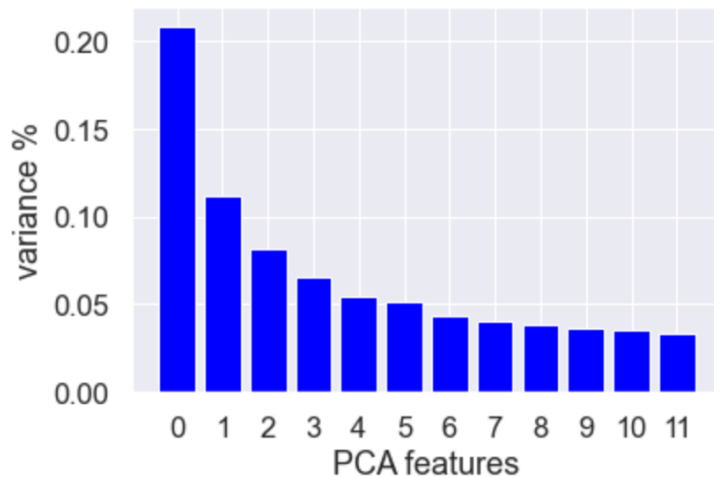
4. Clustering & Optimal Clusters

K-Means clustering

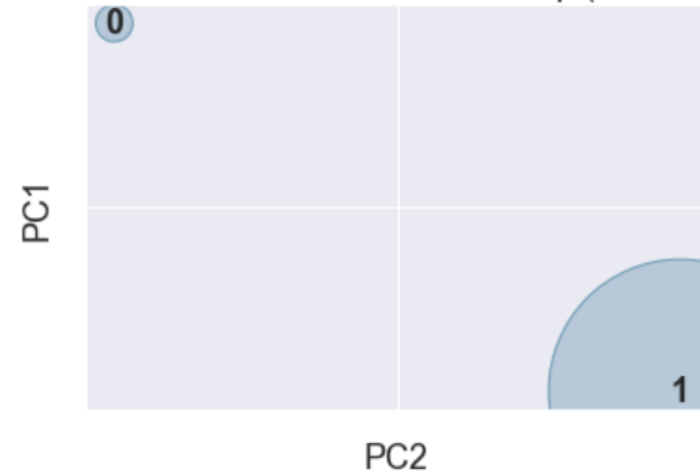


4. Clustering & Optimal Clusters

Principal component analysis (PCA)

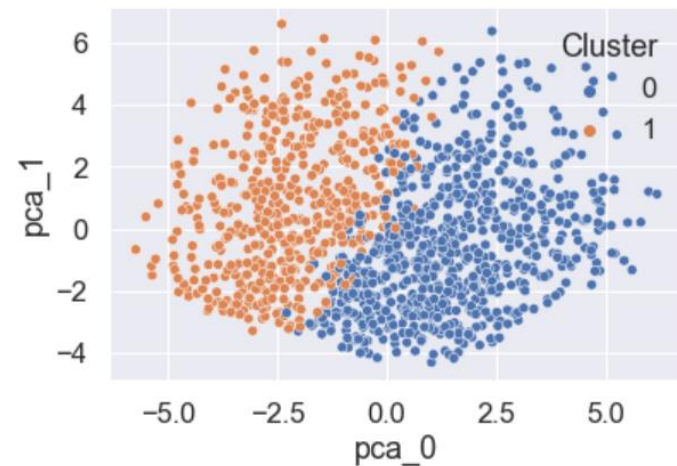
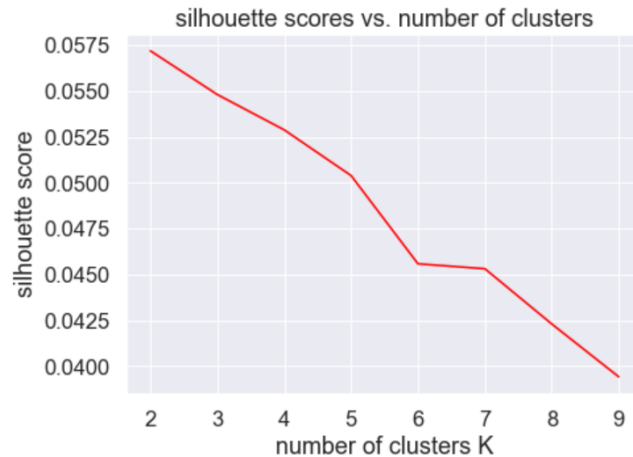
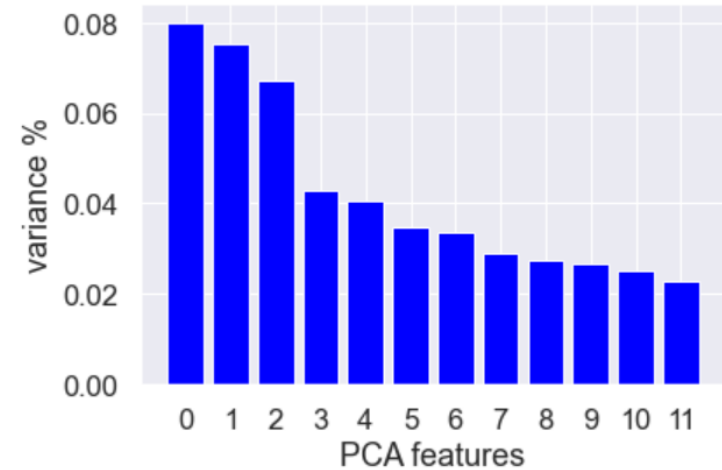
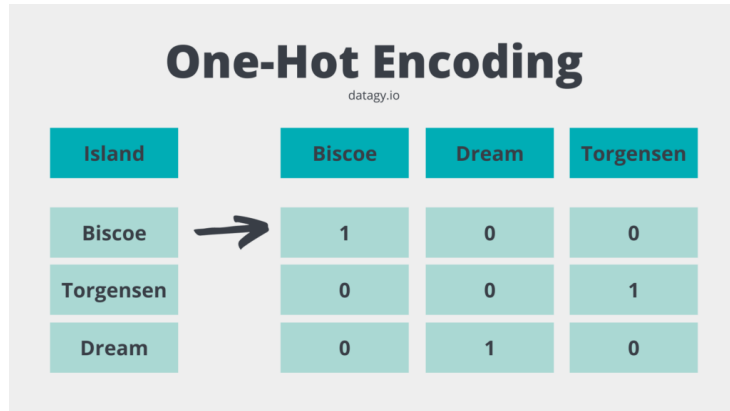


KMeans Intercluster Distance Map (via MDS)



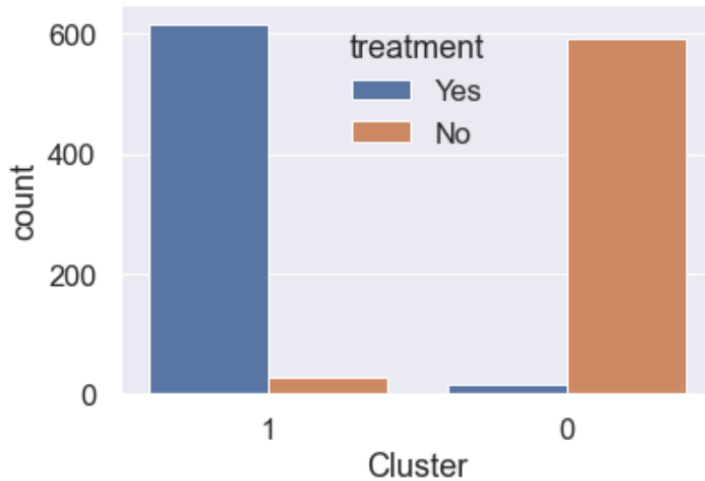
4. Clustering & Optimal Clusters

K-Means clustering with one-hot encoding



4. Clustering & Optimal Clusters

Cluster interpretation: Cluster 1

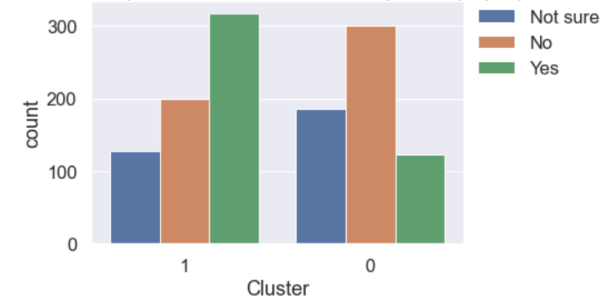


Cluster 1: mostly the people who seek treatment

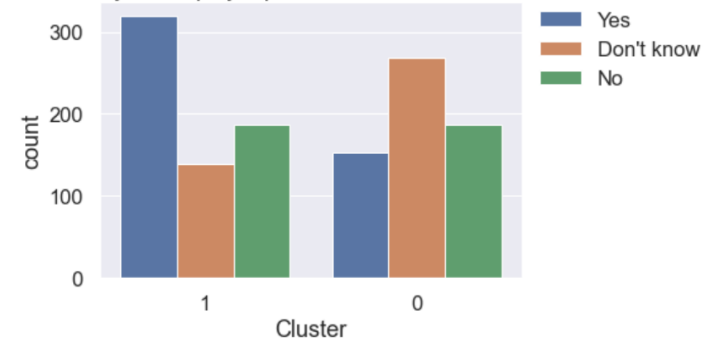
cluster 0: mostly the people who don't seek treatment

The support for them and their psychological behavior

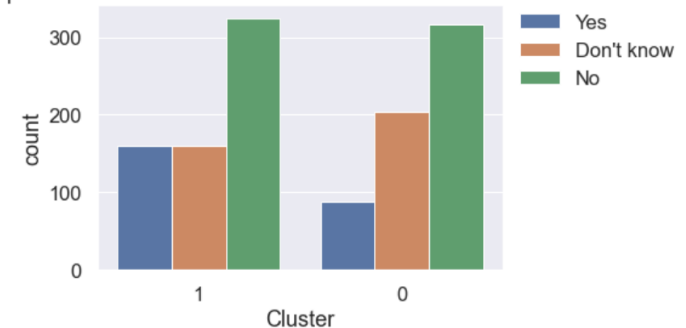
Do you know the options for mental health care your employer provides



Does your employer provide mental health benefits

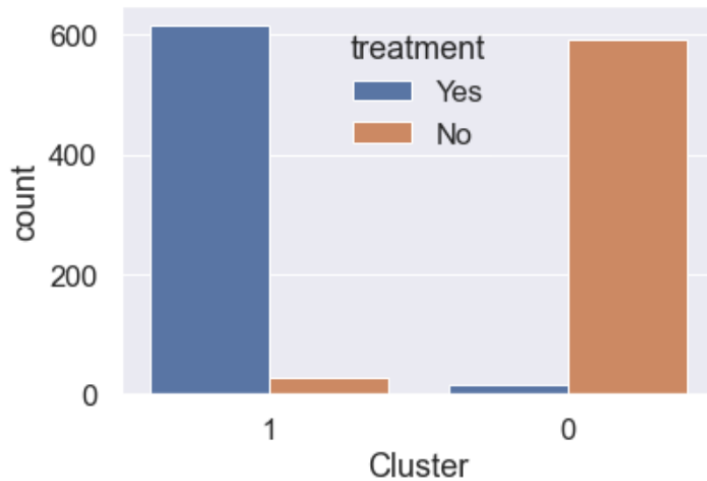


Does your employer provide resources to learn more about mental health issues and how to seek help



4. Clustering & Optimal Clusters

Cluster interpretation Cluster 0

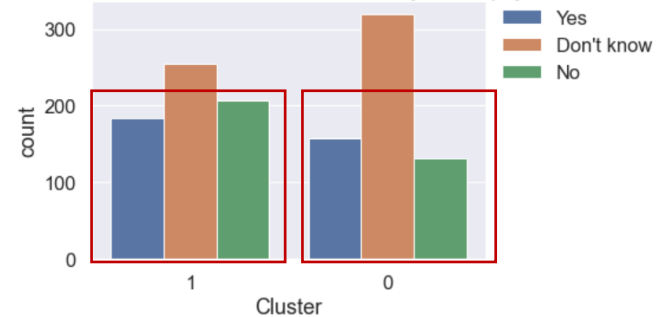


Cluster 1: mostly the people who seek treatment

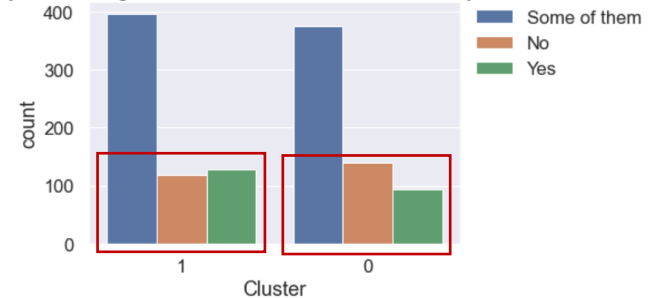
cluster 0: mostly the people who don't seek treatment

The support for them and their psychological behavior

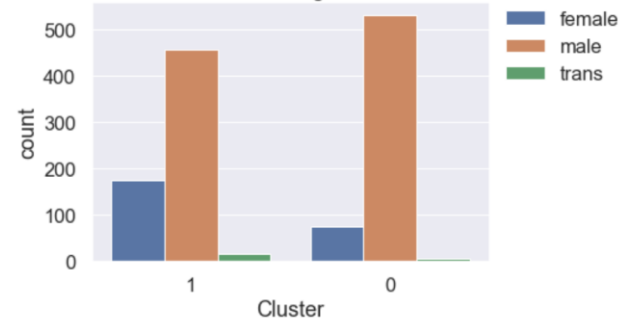
Whether mental health is taken as seriously as the physical



Would you be willing to discuss a mental health issue with your coworkers



The distribution of different genders in the clusters



5. Business Insights & Recommendation

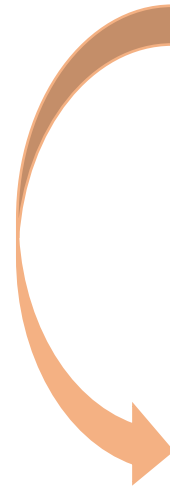
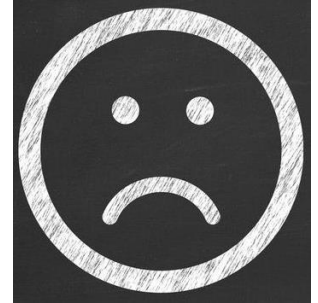
Business Insight

For people who have already sought mental health treatment, they don't think mental health is taken as seriously as the physical health.

Better health care plans and human support

For people who haven't sought mental health treatment, they may feel the inclusion of mental health issues is not good enough

Workplan mental health education



5. Business Insights & Recommendation

Next step

Data:

limitation:

1. Only 1200 data points
2. Limited features
3. Not a good representation of the demographics

Solution:

1. Additional feature (feeling, psychological behavior, mental health conditions)
2. Demographic dataset of people in Tech

Scale up

Strategy:

1. From people in tech to general employee
2. From North America to global

Technology (if 100 times the dataset, computation efficiency):

1. Sampling
2. Parallel processing and modeling
3. CPU to GPU
4. Cloud-based deployment



Acknowledgement

Thank you very much for your help and support!!!!

Elnaz Alipour, Brian Mahoney, Patryk Skowron, Niloofar Jalali, & Daniel Reilly

Chelsey Rodier & Honor Sargent

kaggle **towards**
data science

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Science
Weekly**