



# Kiss Dániel Márk

WP871Q

Customer Analytics

# Exploratory data analysis

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- `.columns()` – 258 unique features
- `.describe()` – statistical informations
- Selecting target value
- `.dropna()` – dropping rows with nan value
- Sorting values by variance – keeping only top 100

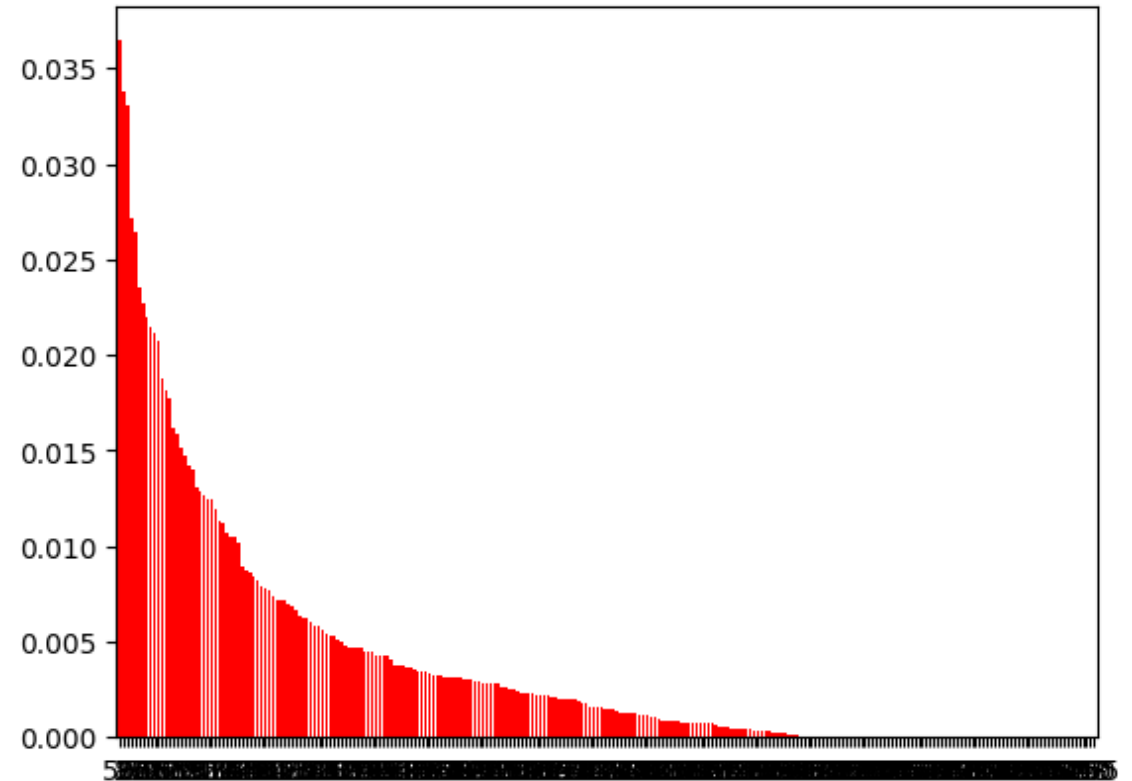


# Feature importance – Decision tree

Feature ranking:

1. Feature 59 (0.036451) Topic42\_ec
2. Feature 7 (0.033796) Topic4\_ec
3. Feature 17 (0.033114) Topic12\_ec
4. Feature 82 (0.027166) Topic63\_ic
5. Feature 68 (0.026388) Topic55\_ic
6. Feature 83 (0.023547) Topic63\_ec
7. Feature 6 (0.022672) Topic4\_ic
8. Feature 61 (0.022005) Topic51\_ec
9. Feature 71 (0.021490) Topic56\_ec
10. Feature 16 (0.021147) Topic12\_ic
11. Feature 21 (0.020700) Topic14\_ec
12. Feature 70 (0.018800) Topic56\_ic
13. Feature 29 (0.018189) Topic19\_ec
14. Feature 66 (0.017777) Topic54\_ic
15. Feature 63 (0.016143) Topic52\_ec
16. Feature 69 (0.015843) Topic55\_ec
17. Feature 28 (0.015169) Topic19\_ic
18. Feature 11 (0.014732) Topic8\_ec
19. Feature 19 (0.014218) Topic13\_ec
20. Feature 9 (0.013975) Topic5\_ec
21. Feature 5 (0.013077) Topic3\_ec
22. Feature 22 (0.012872) Topic15\_ic
23. Feature 35 (0.012644) Topic24\_ec
24. Feature 67 (0.012492) Topic54\_ec
25. Feature 18 (0.012479) Topic13\_ic
26. Feature 15 (0.011904) Topic10\_ec
27. Feature 135 (0.011344) Topic99\_ec
28. Feature 14 (0.011162) Topic10\_ic

Feature importances

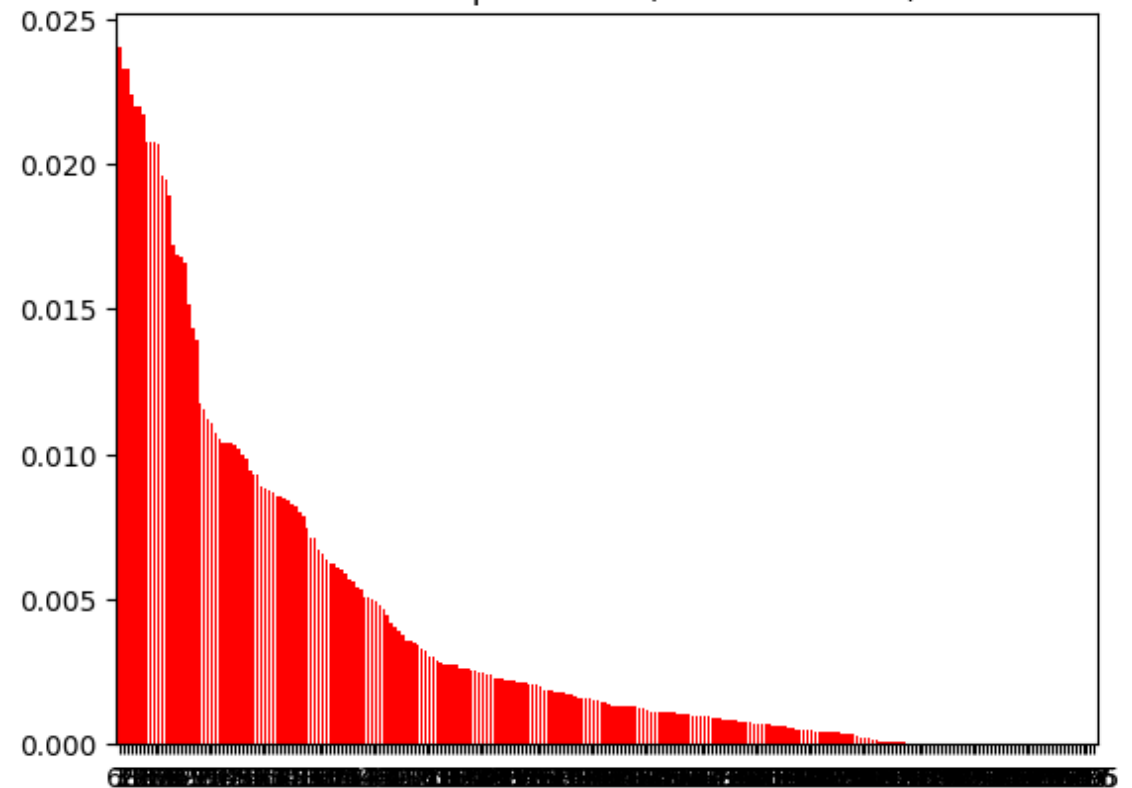


# Feature importance – Random forest

Feature ranking:

1. Feature 7 (0.024002) Topic4\_ec
2. Feature 68 (0.023301) Topic55\_ic
3. Feature 17 (0.023300) Topic12\_ec
4. Feature 19 (0.022358) Topic13\_ec
5. Feature 21 (0.021997) Topic14\_ec
6. Feature 82 (0.021966) Topic63\_ic
7. Feature 16 (0.021674) Topic12\_ic
8. Feature 6 (0.020733) Topic4\_ic
9. Feature 20 (0.020727) Topic14\_ic
10. Feature 83 (0.020715) Topic63\_ec
11. Feature 18 (0.020692) Topic13\_ic
12. Feature 71 (0.019586) Topic56\_ec
13. Feature 59 (0.019439) Topic42\_ec
14. Feature 70 (0.018938) Topic56\_ic
15. Feature 66 (0.017212) Topic54\_ic
16. Feature 4 (0.016882) Topic3\_ic
17. Feature 69 (0.016800) Topic55\_ec
18. Feature 61 (0.016565) Topic51\_ec
19. Feature 67 (0.015176) Topic54\_ec
20. Feature 29 (0.014342) Topic19\_ec
21. Feature 28 (0.013931) Topic19\_ic
22. Feature 1 (0.011768) Topic1\_ec
23. Feature 35 (0.011513) Topic24\_ec
24. Feature 12 (0.011222) Topic9\_ic
25. Feature 22 (0.011047) Topic15\_ic
26. Feature 87 (0.010705) Topic65\_ec
27. Feature 58 (0.010551) Topic42\_ic
28. Feature 14 (0.010405) Topic10\_ic

Feature importances (Random Forest)



# PCA

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REDUCING 258 TO 50  
COMPONENTS



SCALING USING  
STANDARDScaler

# Evaluation – AdaBoost and Random forest with Voting

**0,84538** public score























## Parameter optimization

### Random forest:

- 150 estimators
- Max depth: 12 (15 too much, 10 too few)
- Criterion for cutting: Entropy

### AdaBoost

- 150 estimators
- Learning rate: 1,5

using variance for selecting features and us...
 DanMark • 5 days ago
tSNE 60%
 DanMark • 5 days ago
PCA kommentelve
 DanMark • 8 days ago
64,325%...
 DanMark • 8 days ago
PCA ran, waiting for results tomorrow
 DanMark • 9 days ago
preparing for PCA
 DanMark • 9 days ago
Itt a vége fuss el véle
 DanMark • 9 days ago
reseting to the currently best, continue fro...
 DanMark • 10 days ago
84,275%
 DanMark • 10 days ago
84,538%
 DanMark • 10 days ago
84,362%
 DanMark • 10 days ago
max depth 15 is too much, 84,049%
 DanMark • 10 days ago
random forest parameters 84,3%
 DanMark • 10 days ago
84,194% parameters in adaboost and rando...
 DanMark • 10 days ago
75 percentilis, 100 estimator -> 83,7%
 DanMark • 10 days ago
80 percentilis -> 83,881%
 DanMark • 10 days ago
85 percentilis -> 83,754%
 DanMark • 10 days ago
95 percentile only 81,6%
 DanMark • 10 days ago
83,262% Random forest with Adaboost and ...
 DanMark • 11 days ago
AdaBoost with Bagging 80%
 DanMark • 11 days ago
83,200% with bagging
 DanMark • 11 days ago
83% accuracy
 DanMark • 11 days ago

# Hyper parameters & results

- Before variance – treshold optimization for feature selection
  - Percentile trashold: 0,8 was the best, also tried 0,75;0,85;0,95
- Random forest parameter optimization
  - Max\_depth: 15 - overfitting
  - Estimators number: 100 - too few
  - Trying different criterions: “gini”, “entropy”, “log\_loss”
    - Log\_loss: emphasizes accuracy of probalistic prediction, penalizing confident but incorrect predictions
- AdaBoost parameter optimization
  - Learning rate: 1,7 – too much(0,841), 1 – too slow
  - SAMME algorithm is worse (will be default in future)
- Using GridSearch
  - Was too slow in Laboratory exercise

# Evaluation - PCA



Using nearly the same parameters



0,779 best public score





# Thank you for your attention!

Any questions?

