## experimento 1

## April 15, 2019

In [1]: import pandas as pd

```
import numpy as np
        from os import path
        from sklearn.externals.joblib import Parallel, delayed
In [2]: data = pd.read_csv('/Users/felipecordeiro/IdeaProjects/mobility-analysis/scripts/data...
        y = pd.read_csv('/Users/felipecordeiro/IdeaProjects/mobility-analysis/scripts/labels.ca
In [3]: X = np.squeeze(data.values)
        y = np.squeeze(y.values)
In [4]: from sklearn.linear_model import LogisticRegression
        from sklearn.model_selection import train_test_split
        from sklearn.metrics import accuracy_score, f1_score, precision_score, recall_score, core
        from sklearn import tree, svm, neighbors, model_selection
        from sklearn.naive_bayes import MultinomialNB
        from sklearn.tree import DecisionTreeClassifier
        from sklearn.ensemble import RandomForestClassifier
        from sklearn.neural_network import MLPClassifier
        import numpy as np
  Nao rodei experimentos para sklearn.naive_bayes.ComplementNB - está falhando o import
In [5]: from sklearn.naive_bayes import ComplementNB
        models = []
        cnb_clf = ComplementNB()
        parameters = {
            "complementnb_alpha": [0, 1, 3, 5],
            "complementnb__norm": [True, False],
        }
        cnb_clf.random_state = 42
        np.random.seed(42)
        models.append(("naive_bayes.ComplementNB", cnb_clf, parameters))
In []:
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In [6]: '''
        random_forest_clf = RandomForestClassifier()
        random_forest_clf.random_state = seed
        parameters = {
            "randomforestclassifier n estimators":[10, 20, 30],
            "randomforestclassifier__max_depth": [None, 5, 10, 15, 20]
        models.append(("RandomForestClassifier", random_forest_clf, parameters))
        mnb_clf = MultinomialNB()
        parameters = {
            "multinomialnb__alpha": [0, 1, 3, 5, 10]
        mnb_clf.random_state = seed
        models.append(("naive_bayes.MultinomialNB", mnb_clf, parameters))
        decision_tree_clf = tree.DecisionTreeClassifier()
        decision tree clf.random state = seed
        parameters = {
            "decisiontreeclassifier__max_depth": [None, 2, 5, 8, 10, 15]
        models.append(("decision tree", decision_tree_clf, parameters))
        logistic_regression_clf = LogisticRegression()
        logistic_regression_clf.random_state = seed
        parameters = {
            "logisticregression__penalty": ['l1', 'l2'],
            "logisticregression_ C": [0.01, 0.1, 1, 5, 10, 15, 20]
        models.append(("logistic regression", logistic regression clf, parameters))
        svm_clf = svm.SVC()
        svm_clf.random_state = seed
        parameters = {\'svc_kernel':('linear', 'rbf'), 'svc_C':[0.1, 1, 5, 10, 15, 20]}
        models.append(("svm", svm_clf, parameters))
        mlp_clf = MLPClassifier()
        mlp_clf.random_state = seed
        parameters = {'mlpclassifier__solver': ['lbfgs'],
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'mlpclassifier__activation':['relu'],
                      'mlpclassifier__max_iter': [2000],
                      'mlpclassifier__alpha': 10.0 ** -np.arange(1, 10),
                      'mlpclassifier__tol':[1e-3],
                      'mlpclassifier_hidden_layer_sizes':np.arange(10, 15)}
        models.append(("mlp", mlp_clf, parameters))
        , , ,
        # knn_clf = neighbors.KNeighborsClassifier()
        # knn_clf.random_state = seed
        # parameters = {
              "kneighborsclassifier_n_neighbors": [1, 3, 5, 7, 9],
              "kneighborsclassifier__metric":["cosine", "euclidean"]
        # }
        # models.append(("knn", knn_clf, parameters))
Out[6]: '\nrandom_forest_clf = RandomForestClassifier()\nrandom_forest_clf.random_state = seed
In [7]: scoring = {'accuracy': make_scorer(accuracy_score),
                              'precision_micro': make_scorer(precision_score, pos_label=None,
                              'recall_micro': make_scorer(recall_score, pos_label=None, average
                              'f1_score_micro': make_scorer(f1_score, pos_label=None, average=
                              'precision_macro': make_scorer(precision_score, pos_label=None,
                              'recall_macro': make_scorer(recall_score, pos_label=None, average)
                              'f1_score_macro': make_scorer(f1_score, pos_label=None, average=
In [8]: from sklearn.feature_extraction.text import TfidfVectorizer
        from sklearn.pipeline import Pipeline
        from sklearn.model_selection import GridSearchCV
        from sklearn.model_selection import fit_grid_point
        from sklearn.pipeline import make_pipeline
In [9]: from sklearn import model_selection
        skf = model_selection.StratifiedKFold(n_splits=10, shuffle=True, random_state=42)
        skf
Out[9]: StratifiedKFold(n_splits=10, random_state=42, shuffle=True)
In [10]: results = pd.DataFrame()
         for name, model, parameter in models:
             print('modelo: ', name)
             print(parameter)
             tfidf=TfidfVectorizer(sublinear_tf=True, use_idf=True)
             pipe_model = make_pipeline(tfidf, model)
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gs = GridSearchCV(estimator=pipe_model, param_grid=parameter, scoring=scoring, re-
            gs.fit(X, y)
            print("Best Estimator: \n{}\n".format(gs.best_estimator_))
            print("Best Parameters: \n{}\n".format(gs.best_params_))
            print("Best Test Score: \n{}\n".format(gs.best_score_))
            d = gs.cv_results_
            d['metodo'] = name
            df = pd.DataFrame.from_dict(d)
            results = results.append(df, ignore_index=True)
            print(results)
            results.to_csv('resultados.csv', sep=';', decimal=',')
            print('_____')
modelo: naive_bayes.ComplementNB
{'complementnb_alpha': [0, 1, 3, 5], 'complementnb_norm': [True, False]}
Fitting 10 folds for each of 8 candidates, totalling 80 fits
[Parallel(n_jobs=4)]: Using backend LokyBackend with 4 concurrent workers.
[Parallel(n_jobs=4)]: Done 10 tasks
                                     | elapsed:
                                                     48.0s
[Parallel(n_jobs=4)]: Done 64 tasks
                                      | elapsed: 3.9min
[Parallel(n_jobs=4)]: Done 80 out of 80 | elapsed: 4.9min finished
Best Estimator:
Pipeline (memory=None,
    steps=[('tfidfvectorizer', TfidfVectorizer(analyzer='word', binary=False, decode_error='s
       dtype=<class 'numpy.float64'>, encoding='utf-8', input='content',
       lowercase=True, max_df=1.0, max_features=None, min_df=1,
       ngram_range=(1, 1), norm='12', preprocessor=None, smooth...bulary=None)), ('complements
Best Parameters:
{'complementnb_alpha': 1, 'complementnb_norm': True}
Best Test Score:
0.9589531035865896
  mean_fit_time std_fit_time mean_score_time std_score_time \
0
       1.674078
                     0.044038
                                     1.314617
                                                     0.191792
1
       1.864232
                     0.343803
                                     1.488909
                                                     0.335946
2
       1.448802
                     0.065603
                                     1.223010
                                                     0.081110
3
       1.604972
                     0.153314
                                     1.197670
                                                     0.082874
4
       1.471280
                     0.051409
                                                     0.024375
                                     1.154460
5
       1.448652
                     0.025417
                                     1.131163
                                                     0.018919
6
       1.567797
                     0.108409
                                     1.243982
                                                     0.065907
7
       1.706799
                     0.039831
                                     1.342340
                                                     0.048329
```

```
param_complementnb__alpha param_complementnb__norm
0
                                                  True
                           0
1
                                                 False
2
                           1
                                                  True
3
                           1
                                                 False
4
                           3
                                                  True
5
                           3
                                                 False
6
                           5
                                                  True
7
                           5
                                                 False
                                                        split0_test_accuracy
                                                params
  {'complementnb_alpha': 0, 'complementnb_norm...
                                                                     0.471011
  {'complementnb_alpha': 0, 'complementnb_norm...
1
                                                                     0.949541
  {'complementnb_alpha': 1, 'complementnb_norm...
                                                                     0.954887
  {'complementnb_alpha': 1, 'complementnb_norm...
                                                                     0.951211
 {'complementnb_alpha': 3, 'complementnb_norm...
                                                                     0.953383
5
  {'complementnb_alpha': 3, 'complementnb_norm...
                                                                     0.947034
  {'complementnb_alpha': 5, 'complementnb_norm...
                                                                     0.953049
  {'complementnb_alpha': 5, 'complementnb_norm...
                                                                     0.946867
   split1_test_accuracy
                          split2_test_accuracy
0
               0.481370
                                       0.453634
                                                 . . .
1
               0.952047
                                      0.950710
2
               0.955890
                                       0.959566
                                                 . . .
3
               0.951211
                                      0.954219
4
               0.953551
                                       0.956224
5
               0.947201
                                       0.952214
6
               0.951044
                                       0.953049
                                                 . . .
7
               0.946366
                                       0.952047
                                 split4_train_f1_score_macro
   split3_train_f1_score_macro
0
                       0.556831
                                                     0.576543
1
                       0.899845
                                                     0.900391
2
                       0.871228
                                                     0.870995
3
                       0.859688
                                                     0.860959
4
                       0.842413
                                                     0.841793
5
                       0.838184
                                                     0.837813
6
                       0.830027
                                                     0.830009
7
                       0.829530
                                                     0.829404
                                 split6_train_f1_score_macro
   split5_train_f1_score_macro
0
                       0.567005
                                                     0.584906
1
                       0.898857
                                                     0.899973
2
                       0.871056
                                                     0.871384
3
                       0.859340
                                                     0.860245
4
                       0.841600
                                                     0.842769
5
                       0.837055
                                                     0.837473
6
                       0.828607
                                                     0.828191
```

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7
                      0.827686
                                                    0.827960
   split7_train_f1_score_macro
                                split8_train_f1_score_macro
0
                      0.564672
                                                    0.575933
                      0.901111
                                                    0.898736
1
2
                      0.872159
                                                    0.869824
                      0.860117
3
                                                    0.858796
4
                      0.842633
                                                    0.840245
5
                      0.839946
                                                    0.837584
6
                      0.828528
                                                    0.828075
7
                      0.828658
                                                    0.827613
   split9_train_f1_score_macro
                                mean_train_f1_score_macro
                      0.577309
0
                                                  0.570292
                      0.898424
                                                  0.899771
1
2
                      0.873103
                                                  0.871913
3
                      0.859311
                                                  0.860343
4
                      0.841243
                                                  0.842278
5
                      0.839166
                                                  0.838792
6
                      0.828520
                                                  0.829054
7
                      0.830021
                                                  0.829252
   std_train_f1_score_macro
                                                metodo
0
                   0.008644 naive_bayes.ComplementNB
1
                   0.000928 naive_bayes.ComplementNB
                   0.001437 naive_bayes.ComplementNB
2
3
                   0.001035 naive_bayes.ComplementNB
4
                   0.001149 naive_bayes.ComplementNB
5
                   0.001303 naive_bayes.ComplementNB
6
                   0.000791 naive_bayes.ComplementNB
                   0.001475 naive_bayes.ComplementNB
[8 rows x 183 columns]
In []:
In []:
In []:
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