CS540 Programming Homework 3 Solution

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In [1]: from collections import Counter, OrderedDict
        import pandas as pd
        import numpy as np
        import itertools
        import math
        import ast
        import sys
        data = pd.read_csv('tmdb_5000_movies.csv')
        print(data.shape)
(4803, 20)
In [2]: # Extract the columns for budget, genres, runtime, vote_average, vote_count, revenue
        data = data[['budget', 'genres', 'runtime', 'vote_average', 'vote_count', 'revenue']]
        print(data.shape)
(4803, 6)
In [3]: # Remove all data points with missing features
        data = data.dropna(axis=0, how='any')
        print(data.shape)
(4801, 6)
In [4]: data = data.loc[(data != 0).all(axis=1)]
        print(data.shape)
(3227, 6)
In [5]: data = data[data.astype(str)['genres'] != '[]']
        data['genres'] = data['genres'].map(lambda x: [d['name']
                                                        for d in ast.literal_eval(x)])
        print(data.shape)
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In [6]: # convert revenue column into binary variable
        thresh = 10000000
        y = data['revenue'].map(lambda x: x > thresh).astype(int).values
        data = data.drop(['revenue'], axis=1)
        print(data.shape)
(3226, 5)
In [7]: # convert budget, genres, runtime, vote_average, vote_count columns
        # into categorical data
        epsilon = 0.01
        # get a random k, where 2 <= k <= 10
        k_list = np.random.randint(low=2, high=11, size=(5,), dtype=np.int8)
        min_list = data.min(axis=0)
        max_list = data.max(axis=0)
        # qet a random k, where 2 <= k <= 9 and add 'other' as
        # additional category with most common k genres
        genres_list = [name for name, count in Counter(data['genres'].sum()).most_common(
            np.random.randint(low=2, high=10))] + ['Other']
        k_list[1] = len(genres_list)
In [8]: h_y = -sum((val/len(y)*math.log2(val/len(y)))
                    for _, val in dict(Counter(y)).items())) # binary entropy
        output = pd.DataFrame((np.zeros((5, 3), dtype=object)),
                              columns=['k', 'info_gain', 'num_pos/neg'])
        output.index = ['budget', 'genres', 'runtime', 'vote_average', 'vote_count']
        output['k'] = k_list
        for ind, col in enumerate(data):
            # convert features into categorical data
            if col == 'genres':
                # map to 1 - K + 1 categories, where K is a random number between 2 and 9
                data[col] = data[col].map(lambda x: genres_list.index(x[0])
                                          if x[0] in genres_list else k_list[ind]-1)
            else:
                # map to 1 - K categories, where K is a random number between 2 and 10
                data[col] = data[col].map(lambda x: math.floor((x - min_list[ind])/(
                        (max_list[ind] + epsilon - min_list[ind]) / k_list[ind])))
            # count number of positive and negative examples for each feature
            d = OrderedDict.fromkeys(list(itertools.product())
                range(0, 2), range(0, k_list[ind]))), 0)
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(3226, 6)

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d.update(dict(Counter(list(zip(y, data[col])))))
            for key in list(itertools.product([0], range(k_list[ind]))):
                d.move_to_end(key)
            d = OrderedDict(sorted(d.items(), key=lambda x: x[0][1]))
            output.at[col, 'num_pos/neg'] = list(d.values())
            # compute the information gain
            count_x = dict(Counter(data[col]))
            h_yx = - sum(val/len(y)*math.log2(val/count_x[key[1]])
                         for key, val in d.items() if val != 0) # conditional entropy
            output.at[col, 'info_gain'] = format(h_y - h_yx, '.8f')
In [9]: output
Out [9]:
                          info_gain
                                                                           num_pos/neg
                                     [1851, 549, 554, 8, 172, 0, 70, 0, 19, 0, 2, 0...
        budget
                      7 0.06780851
                      4 0.01141179
                                               [556, 189, 518, 116, 97, 21, 1498, 231]
        genres
        runtime
                      3 0.00245520
                                                            [2451, 531, 217, 25, 1, 1]
        vote_average 7 0.00474029
                                     [3, 5, 13, 9, 122, 38, 592, 110, 1107, 219, 70...
        vote_count
                      9 0.04289481
                                     [2084, 549, 347, 7, 131, 1, 56, 0, 29, 0, 11, ...
In [10]: output['result'] = output['num_pos/neg'].map(lambda x: ','.join(map(str, x)))
         output[['k', 'info_gain', 'result']].apply(
             lambda x: ','.join(x.fillna('').map(str)), axis=1).to_csv(
             'output.txt', header=None, index=None, sep=' ')
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