RecSys BrickMover's Source Code

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Source Code

1. Yuyu

• benchmark.py

Our naive benchmark depending on several types of averages.

```
\# -*- \text{ coding: utf-8 } -*-
    from time import time
    from collections import defaultdict
    import pylab as pl
   import json
    def outputFinalPredict(pre, outfile , testdata):
        schema = []
        for line in file (testdata):
            js = json.loads(line)
11
            rid = js['review_id']
            schema.append([rid])
        f = file (outfile, 'w')
        f.write('review_id, stars\n')
        for i, parts in enumerate(schema):
            parts.append(str(pre[i]))
            f.write(', ', join(parts) + '\n')
        f.close()
    def readTrainingDict(filename):
        ku = dict()
        ki = dict()
        for line in file (filename):
            js = json.loads(line)
            uid = js['user\_id']
26
            iid = js['business_id']
            ku[uid] = 1
            ki[iid] = 1
        return ku, ki
31
    def getSparseMat():
        user = defaultdict(lambda:defaultdict(lambda:0))
        item = defaultdict(lambda:defaultdict(lambda:0))
        ratings = []
        for line in file (data_path + 'yelp_training_set_review.json'):
            js = json.loads(line)
            uid = js['user\_id']
            iid = js['business\_id']
            rating = js['stars']
            ratings.append(rating)
```

```
user[uid][iid] = rating
             item[iid][uid] = rating
         return user, item, ratings
    def getSampleAvg(ratings):
         user\_avg = dict()
         item\_avg = dict()
         for u, items in user.items():
             user_avg[u] = pl.average(items.values())
         for i, users in item.items():
             item\_avg[i] = pl.average(users.values())
         global_avg = pl.average(ratings)
         return user_avg, item_avg, global_avg
    def getPopAvg():
         user_avg_given = dict()
         item\_avg\_given = dict()
         item\_avg\_predict = dict()
         user_review_cnt_given = dict()
         item\_review\_cnt\_given = dict()
61
         for line in file (data_path + 'yelp_training_set_user .json'):
             js = json.loads(line)
             uid = js['user\_id']
             avg = js['average_stars']
             review\_cnt = js['review\_count']
66
             user_avg_given[uid] = avg
             user_review_cnt_given [uid] = review_cnt
         for line in file (data_path + 'yelp_training_set_business.json'):
             js = json.loads(line)
             iid = js['business_id']
71
             avg = js['stars']
             review_cnt = js['review_count']
             item\_avg\_given[iid] = avg
             item_review_cnt_given[iid] = review_cnt
         return user_avg_given, item_avg_given, user_review_cnt_given, item_review_cnt_given
 76
     def getInferAvg():
         user_avg_infer = dict()
         for uid in user_avg_given:
             if uid in user_avg:
81
                 cnt_given = user_review_cnt_given[uid]
                 cnt\_train = len(user[uid])
                 avg\_given = user\_avg\_given[uid]
                 avg\_train = user\_avg[uid]
                 if cnt_given > cnt_train:
86
                 \#if cnt_given - cnt_train == 1:
                      infer = (avg_given * cnt_given - avg_train * cnt_train)*1.0 / (cnt_given - cnt_train)
                      if infer >= 1.0 and infer <= 5.0:
                          user\_avg\_infer[uid] = infer
91
         item\_avg\_infer = dict()
         for iid in item_avg_given:
             if iid in item_avg:
                 cnt_given = item_review_cnt_given[iid]
                 cnt\_train = len(item[iid])
                 avg\_given = item\_avg\_given[iid]
                 avg\_train = item\_avg[iid]
                 if cnt_given > cnt_train:
                      infer = (avg_given * cnt_given - avg_train * cnt_train)*1.0 / (cnt_given - cnt_train)
                      if infer >= 1.0 and infer <= 5.0:
101
                          item_avg_infer[iid] = infer
         return user_avg_infer, item_avg_infer
    def getPrediction(filename):
106
         pre = []
         for line in file (testing):
             js = json.loads(line)
```

```
uid = js['user\_id']
             iid = js['business\_id']
111
             if uid in user_avg_given and iid in item_avg_given:
                 pre.append(0.4*user\_avg\_given[uid] + 0.6*item\_avg\_given[iid])
             elif uid in user_avg_given and iid not in item_avg_given:
                 if uid in user_avg_infer:
                     pre.append(user_avg_infer[uid])
116
                 else:
                     pre.append(0.4*user\_avg\_given[uid] + 0.6*global\_avg)
             elif uid not in user_avg_given and iid in item_avg_given:
                     pre.append(item_avg_given[iid])
             elif uid not in user_avg_given and iid not in item_avg_given:
121
                 if uid in user_avg:
                     pre.append(0.4*user\_avg[uid] + 0.6*global\_avg)
                 else:
                     pre.append(global_avg)
         return pre
126
    begin = time()
    data_path = './Data/'
    testing = data_path + 'final_test_set_review . json'
     outfile = 'Benchmark_InferAvg.csv'
    user, item, ratings = getSparseMat()
    user_avg, item_avg, global_avg = getSampleAvg(ratings)
    user_avg_given, item_avg_given, user_review_cnt_given, item_review_cnt_given = getPopAvg()
     user_avg_infer, item_avg_infer = getInferAvg()
    pre = getPrediction(outfile)
    outputFinalPredict(pre, outfile, testing)
141
    print '\nTotal_Execution_Time:_\%.3fs' \% (time() - begin)

    model_easy_ml.py

    An easy linear machine learning model.
    \# -*- \text{ coding: utf-8 } -*-
    from time import time
    from sklearn import sym
    from sklearn.preprocessing import StandardScaler
    from sklearn.linear_model import LinearRegression, Ridge, RidgeCV, SGDRegressor
    from sklearn.datasets import load_symlight_file, load_symlight_files
    from sklearn.ensemble import RandomForestRegressor, GradientBoostingRegressor, ExtraTreesRegressor
    from sklearn.metrics import mean_squared_error
    from collections import defaultdict
    from sklearn.tree import DecisionTreeRegressor
    import pylab as pl
    import numpy as np
    from math import sqrt
    import json
    def readItemJson():
         js\_dic = dict()
         for line in file (data_path + 'yelp_training_set_business.json'):
             js = json.loads(line)
             iid = js['business\_id']
21
             js_dic [iid] = js
         for line in file (data_path + 'yelp_test_set_business .json'):
             js = json.loads(line)
             iid = js['business\_id']
             js_dic[iid] = js
26
         return js_dic
    def readUserJson():
```

```
js\_dic = dict()
        for line in file (data_path + 'yelp_training_set_user .json'):
31
             js = json.loads(line)
             uid = js['user\_id']
             js\_dic [uid] = js
        for line in file (data_path + 'yelp_test_set_user .json'):
             js = json.loads(line)
36
             uid = js['user\_id']
             js\_dic [uid] = js
        return js_dic
   def readDict(filename):
        dic = dict()
        for line in file (filename):
             rec = line. strip(). split('\t')
             \operatorname{dic}[\operatorname{rec}[0]] = \operatorname{int}(\operatorname{rec}[1])
        return dic
46
    def getBlankDict(fromdic):
        dic = dict()
        for k in fromdic.keys():
             dic[k] = 0
        return dic
    def getData(filename):
        X = []
        y = []
56
        for line in file (filename):
             js = json.loads(line)
             uid = js['user\_id']
             iid = js['business\_id']
             rating = js['stars']
61
             item_js = item_jsons[iid]
             ct = item_js['city']
             review_cnt = item_js['review_count']
             longitude = item_js['longitude']
66
             latitude = item_js['latitude']
             cats = item_js['categories']
             addr = item_js['full_address']
             opened = item_js['open']
71
             open_flag = 0
             if opened:
                 open\_flag = 1
             city_feature = getBlankDict(city)
76
             city\_feature [ct] = 1
             category_feature = getBlankDict(category)
             for c in cats:
                 category_feature[c] = 1
81
             code\_feature = getBlankDict(code)
             cd = addr.split(' _-')[-1]
             {\rm code\_feature}\,[{\rm cd}]\,=1
86
             sample = [review_cnt, open_flag] \
                     + category_feature.values() \
                     + city_feature.values() \
                     + code_feature.values()
             X.append(sample)
            y.append(rating)
        return X, y
    def outputFinalPredict(pre, outfile , testdata):
        schema = []
        for line in file (testdata):
```

```
js = json.loads(line)
             uid = js['user_id']
             iid = js['business\_id']
             schema.append([uid, iid])
101
         f = file (outfile, 'w')
         f.write('user_id, business_id, stars\n')
         for i, parts in enumerate(schema):
             parts.append(str(pre[i]))
             f.write(', '.join(parts) + '\n')
106
         f.close()
     begin = time()
111
     data\_path = './Data/'
     testing = data_path + 'yelp_test_set_review.json'
     X_train, y_train, X_test, y_test = load_symlight_files (('train', 'test'))
     print '\nData_loading_complete_in_%.3fs\n' % (time() - begin)
116
     \#regr = LinearRegression()
     \#regr = Ridge()
     regr = SGDRegressor()
121
     regr. fit (X_train, y_train)
     pre = regr.predict(X_test)
     outfile = 'easyML.csv'
     outputFinalPredict(pre, outfile, testing)
     print '\nTotal_Execution_Time:_\%.3fs' \% (time() - begin)
  \bullet generate\_cross\_binary\_features.py
     A general framework to generate cross binary features.
    \# -*- coding: utf-8 -*-
     from time import time
     from collections import defaultdict
     import re
    import json
     import pylab as pl
     import numpy as np
     def getIdMap():
         iid = dict()
         for line in file ('itemmap.final'):
             item, mapped = line.strip().split ('\t')
             iid [item] = int(mapped)
         uid = dict()
 16
         for line in file ('usermap.final'):
             user, mapped = line.strip().split ('\t'')
             uid[user] = int(mapped)
         return iid, uid
21
     begin = time()
     data_path = '.../Data/'
     outfile = 'Yuyu_CategoryPopAvg_50bins.txt'
     iid\_map,\; uid\_map = getIdMap()
     biz_{js} = []
     for line in file (data_path + 'yelp_training_set_business.json'):
         biz_js .append(json.loads(line))
```

```
category\_reviewcnt = defaultdict(lambda:0)
    category_reviewcnt_x_stars = defaultdict(lambda:0)
   category_popavg = dict()
    cnt = 0
    for js in biz_js:
        iid = js['business_id']
        cats = js['categories']
41
        reviewcnt = js['review_count']
        stars = js['stars']
        for c in cats:
            category_reviewent[c] += reviewent
            category_reviewcnt_x_stars[c] += stars*reviewcnt
46
            break
    for c in category_reviewent:
        category_popavg[c] = category_reviewcnt_x_stars[c]*1.0/category_reviewcnt[c]
51
    for line in file (data_path + 'final_test_set_business .json'):
        biz_js .append(json.loads(line))
    ITEM\_FEATURE\_\_CatogoryPopAvg = dict()
   for js in biz_js:
        mapped_iid = iid_map[js['business_id']]
        cats = js['categories']
        if len(cats) > 0 and cats[0] in category_popavg:
            ITEM_FEATURE_CatogoryPopAvg[mapped_iid] = category_popavg[cats[0]]
        else:
            ITEM_FEATURE_CatogoryPopAvg[mapped_iid] = np.mean(category_popavg.values())
    def get_bins_1_idx(value):
       bincnt = 50
66
        minv = 1
        maxv = 5
        binwidth = (maxv-minv)*1.0/bincnt
        idx = int((value - minv)/binwidth)
        return idx
71
    f = file (outfile, 'w')
    for mapped_iid in sorted(iid_map.itervalues()):
        if mapped_iid in ITEM_FEATURE__CatogoryPopAvg:
            f.write('%d\t%d:1\n' % (mapped_iid, get_bins_1_idx(ITEM_FEATURE__CatogoryPopAvg[mapped_iid])))
    f.close()
    print '\nTotal_Execution_Time:_\%.3fs' \% (time() - begin)
 • generate_feature_ReviewCountContainFinalTest.py
    Generate the feature of review count, taking testing set review pairs into consideration.
    \# -*- \text{ coding: utf-8 } -*-
    from time import time
   import json
    import pylab as pl
    import numpy as np
    from collections import defaultdict
    import os
    def getIdMap():
        iid = dict()
        for line in file ('itemmap.final'):
            item, mapped = line.strip().split ('\t'')
            iid[item] = int(mapped)
14
        uid = dict()
```

```
for line in file ('usermap.final'):
            user, mapped = line.strip().split ('\t')
            uid[user] = int(mapped)
        return iid, uid
19
    def readJsons():
        biz_js = []
        for line in file (data_path + 'yelp_training_set_business.json'):
            biz_js .append(json.loads(line))
24
        for line in file (data_path + 'final_test_set_business .json'):
            biz_js .append(json.loads(line))
        user_{js} = []
        for line in file (data_path + 'yelp_training_set_user.json'):
29
            user_js.append(json.loads(line))
        for line in file (data_path + 'final_test_set_user .json'):
            user_js.append(json.loads(line))
        return biz_js, user_js
34
    def readTest():
        t_item = defaultdict(lambda:defaultdict(lambda:0))
        t_user = defaultdict(lambda:defaultdict(lambda:0))
        for line in file (testing_set):
39
            js = json.loads(line)
            uid = js['user\_id']
            iid = js['business\_id']
            t_{id} = 0
            t_user[uid][iid] = 0
        return t_user, t_item
    def get_bins_1_idx (value):
        bincnt = 20
        t = np.log(rvcnt.values())
49
        \max v = \text{np.max}(t)
        minv = np.min(t)
        binwidth = (maxv-minv)*1.0/bincnt
        idx = int((np.log(value) - minv)/binwidth)
        return idx
54
    data_path = '../Data/'
    training\_set = data\_path + `yelp\_training\_set\_review.json'
    testing_set = data_path + 'final_test_set_review .json'
    outfile = 'Yuyu_UserReviewCountContainFinalTest_21bins.txt'
    iid_map, uid_map = getIdMap()
    t_{user}, t_{item} = readTest()
    biz_js, user_js = readJsons()
    rvcnt = dict()
    for js in user_js:
        uid = js['user\_id']
        reviewcnt = js['review_count']
        rvcnt[uid\_map[uid]] = reviewcnt + len(t\_user[uid])
    f = file (outfile, 'w')
    for mapped_uid in sorted(uid_map.itervalues()):
        if mapped_uid in rvcnt:
            f.write('\%d\t\%d:1\n'\%\ (mapped\_uid,\ get\_bins\_1\_idx(rvcnt[mapped\_uid])))
    f.close()
   generate\_features\_Gender.py
    Generate gender features
    \# -*- coding: utf-8 -*-
```

```
from time import time
        from collections import defaultdict
        import re
        import json
        import numpy as np
        def getIdMap():
            iid = dict()
            for line in file ('itemmap.final'):
    12
                item, mapped = line.strip().split('\t')
                 iid [item] = int(mapped)
            uid = dict()
            for line in file ('usermap.final'):
                user, mapped = line.strip().split ('\t'')
    17
                uid[user] = int(mapped)
            return iid, uid
        def getNameList(filename):
            names = dict()
    22
            for line in file (filename):
                names[line. split (' \_') [0]. lower()] = 1
            return names
    27
        begin = time()
        data_path = '.../Data/'
         outfile = 'Yuyu_UserGender.txt'
    32
        iid_map, uid_map = getIdMap()
        male_name = getNameList('dist.male.first.txt')
        female_name = getNameList('dist.female.first.txt')
        user_{js} = []
        for line in file (data_path + 'yelp_training_set_user.json'):
             user_js.append(json.loads(line))
        for line in file (data_path + 'final_test_set_user .json'):
             user_js.append(json.loads(line))
    42
        user\_gender = defaultdict(lambda:0)
        for js in user_js:
            mapped\_uid = uid\_map[js['user\_id']]
    47
            name = js['name'].lower()
             if name in male_name:
                user\_gender[mapped\_uid] = 1
             elif name in female_name:
                user\_gender[mapped\_uid] = 2
    52
        f = file (outfile, 'w')
        for mapped_uid in sorted(uid_map.itervalues()):
            f.write('\%d\backslash t\%d:1\backslash n'\%\ (mapped\_uid,\, user\_gender[mapped\_uid]))
        f.close()
        print '\nTotal_Execution_Time:_%.3fs' % (time() - begin)
2. Liang
      • CategoryKnn.py
        Business has the same category.
        import sys
        import json
```

```
Cat\_Bid\_Map = \{\}
   Bid_Cat_Map = \{\}
    idx_c = 0
    for line in open('../Data/yelp_training_set_business_s.json'):
        js = json.loads(line)
10
        bid = js['business_id']
        \operatorname{cset} = \operatorname{tuple}(\operatorname{js}[\operatorname{'categories'}])
        Bid_Cat_Map[bid]=cset
        if cset not in Cat_Bid_Map:
            Cat\_Bid\_Map[cset] = [bid]
15
        else:
            Cat_Bid_Map[cset].append(bid)
    for line in open('../Data/yelp_test_set_business_s.json'):
        js = json.loads(line)
        bid = js['business_id']
        cset = tuple(js['categories'])
        Bid\_Cat\_Map[bid] = cset
        if cset not in Cat_Bid_Map:
            Cat\_Bid\_Map[cset] = [bid]
        else:
            Cat_Bid_Map[cset].append(bid)
    print len(Cat_Bid_Map)
    outf = open('../GlobalFeature/i/KateKnn.txt','w')
    outf.write('%d\n'\%(14334))
    for item in range (14334):
        outf.write('%d\t'%(item))
35
        for k in Cat_Bid_Map[Bid_Cat_Map[item]]:
            outf.write('\%d:\%f\backslash t'\%(k,0.5/len(Cat\_Bid\_Map[Bid\_Cat\_Map[item]])))
        outf.write('\n')
    outf.close()
 • ItemCategoryAll.py
    Business's category binary feature.
   import sys
    import json
    Cat\_Bid\_Map = \{\}
    Bid_Cat_Map = \{\}
    idx_c = 0
    for line in open('../Data/yelp_training_set_business_s.json'):
        js = json.loads(line)
        bid = js['business_id']
11
        cset = tuple(js['categories'])
        if cset not in Cat_Bid_Map:
            Cat\_Bid\_Map[cset] = idx\_c
            idx_c+=1
16
        Bid_Cat_Map[bid]=Cat_Bid_Map[cset]
    for line in open('../Data/yelp_test_set_business_s.json'):
        js = json.loads(line)
        bid = js['business_id']
        cset = tuple(js['categories'])
        Bid_Cat_Map[bid]=cset
26
        if cset not in Cat_Bid_Map:
            Cat\_Bid\_Map[cset] = idx\_c
```

```
idx_c += 1
        Bid_Cat_Map[bid]=Cat_Bid_Map[cset]
    print len(Cat_Bid_Map)
    outf = open('../GlobalFeature/i/ItemCategories.txt', 'w')
   outf.write('%d\n'%(len(Cat_Bid_Map)))
    for item in range(14334):
        if item in Bid_Cat_Map:
            outf.write('%d\t%d:1\n'%(item,Bid_Cat_Map[item]))
    outf.close()
 • ItemLocationKnn.py
    Business nearby k Business (the distance caculate by Longitude and Latitude).
    import numpy
    import json
    import math
    from sklearn.neighbors import kneighbors_graph
    k = 5
    Item_Num = 12742
   item_f = \{\}
    item\_latitude = [0]*Item\_Num
    item_longitude=[0]*Item_Num
    item_location=[0]*Item_Num
15
    for line in open('../Data/yelp_training_set_business_s.json'):
        js = json.loads(line)
        bid = js['business_id']
        item_latitude [bid]=[js['latitude']]
        item_longitude[bid]=[js['longitude']]
20
        item_location[bid]=[js['latitude'], js['longitude']]
    for line in open('../Data/yelp_test_set_business_s.json'):
        js = json.loads(line)
        bid = js['business\_id']
        item_latitude [bid]=[js['latitude']]
        item_longitude[bid]=[js['longitude']]
        item_location[bid]=[js['latitude'], js['longitude']]
    print 'load_over!'
    latitude_knn = kneighbors_graph(item_latitude,k). tolil ().rows
    print '1'
    longitude_knn = kneighbors_graph(item_longitude,k).tolil().rows
    print '2'
    location_knn = kneighbors_graph(item_location,k). tolil ().rows
    print '3'
    fout0 = open('../GlobalFeature/i/ItemKnnLatitude.txt','w')
   fout1 = open('../GlobalFeature/i/ItemKnnLongitude.txt','w')
    fout2 = open('../GlobalFeature/i/ItemKnnLocation.txt','w')
    fout0.write('%d\n'%Item_Num)
    fout1.write('%d\n'%Item_Num)
   fout 2.write (\,{}^{,}\%d \backslash n^{,}\%Item\_Num)
    for line in open('../Data/yelp_test_set_business_s.json'):
        js = json.loads(line)
        bid = js['business_id']
```

 $fout0.write('\%d\t'\%(bid+1))$

fout1.write('%d\t'%(bid+1)) fout2.write('%d\t'%(bid+1))

50

```
if item_latitude[bid]==0:
            fout0.write('%d:1\n'%(Item_Num))
            fout1.write('%d:1\n'%(Item_Num))
            fout2.write('%d:1\n'%(Item_Num))
            continue
        for item in latitude_knn[bid]:
            fout0.write('\%d:1\t'\%(item))
        for item in longitude_knn[bid]:
60
            fout1.write('%d:1\t'%(item))
        for item in location_knn[bid]:
            fout2.write('%d:1\t'%(item))
        fout0.write('\n')
        fout1.write('\n')
65
        fout2.write('\n')
    fout0.close()
    fout1.close()
    fout2.close()
```

• SimpleItemFeature.py

Generate the business feature from [yelp_training_set_business.json] and [yelp_test_set_business.json] directly, such as city, state, review count and category information.

```
import numpy
    import json
    import math
    item_f = \{\}
    item_city={}
    idx_city = 0
    item\_review\_count = \{\}
    item\_state = \{\}
    idx_state = 0
    item_categories={}
    idx_cat=0
    maxv=0
   minv=100
    for line in open('../Data/yelp_training_set_business_s.json'):
        js = json.loads(line)
        bid = js['business_id']
        if js['city'] not in item_city:
21
            item\_city [js ['city']] = idx\_city
            idx\_city +=1
        log_review=math.log(js['review_count'],2)
        if log_review<minv:
            minv=log_review
26
        if log_review>maxv:
            \max = \log_{\text{review}}
        if js ['state'] not in item_state:
            item_state[js['state']]=idx_state
31
            idx\_state+=1
        for c in js['categories']:
            if c not in item_categories:
                item\_categories[c]=idx\_cat
                idx\_cat += 1
        item_f[bid]=[item_city[js['city']], log_review, item_state[js['state']], item_categories[c] for c in js['categories']], js['
             open']]
    print 'city:%d'%idx_city
    print 'state:%d'%idx_state
    print 'categories:%d'%idx_cat
41
    for line in open('../Data/yelp_test_set_business_s.json'):
        js = json.loads(line)
        bid = js['business_id']
        if js['city'] not in item_city:
```

```
item_city [js['city']]=idx_city
46
             idx\_city +=1
        log_review=math.log(js['review_count'],2)
        if log_review<minv:
             minv=log_review
        if log_review>maxv:
51
             maxv=log_review
        if js ['state'] not in item_state:
             item_state[js['state']]=idx_state
             idx_state +=1
        for c in js ['categories']:
56
             if c not in item_categories:
                 item_categories [c]=idx_cat
                 idx_cat += 1
        item_f[bid]=[item_city[js['city']], log_review, item_state[js['state']], item_categories[c] for c in js['categories']], js['
             open']]
61
    print 'city:%d'%idx_city
    print 'state:%d'%idx_state
    print 'categories:%d'%idx_cat
    fout0 = open('../GlobalFeature/i/ItemCity.txt', 'w')
    fout1 = open('../GlobalFeature/i/ItemReview.txt','w')
    fout2 = open('../GlobalFeature/i/ItemState.txt', 'w')
    fout3 = open('../GlobalFeature/i/ItemCategories.txt', 'w')
    fout4 = open('../GlobalFeature/i/ItemOpen.txt','w')
    fout0.write('%d\n'%(idx_city))
    fout1.write('%d\n'\%51)
    fout2.write('%d\n'%(idx_state))
    fout 3.write(\,{}^{\backprime}\%d\ n\,{}^{\backprime}\%(idx\_cat+1))
    fout4.write('2\n')
    for item in item_f:
        fout0.write('%d\t%d:1\n'%(item,item_f[item][0]))
        fout1.write(^{\prime}\%d\t\%d:1\n^{\prime}\%((item,(item_f[item][1]-minv)/(maxv-minv)*50)))
        fout2.write(\'\%d\t\%d:1\n'\%(item,item\_f[item][2]))
81
        fout3.write('%d\t'%(item))
        weight=1.8
        for c in item_f[item][3]:
             if \operatorname{len}(\operatorname{item}_f[\operatorname{item}][3]) == 1:
                 fout3.write('%d:%.3f\t'%(c,(1.0/len(item_f[item][3]))**0.5))
             else:
                 fout3.write(\%d:\%.3f\t\%(c,(1.0/len(item_f[item][3])*weight)**0.5))
                 weight=1.0/(len(item_f[item][3])-1)
        if len(item_f[item][3]) == 0:
             fout3.write('%d:1'%idx_cat)
91
        fout3.write('\n')
        if item_f[item][4]:
             fout4.write(\%d\t\%d:1\n\%(item,1))
             fout4.write('\%d\t\%d:1\n'\%(item,0))
    fout0.close()
    fout1.close()
    fout2.close()
    fout3.close()
    fout4.close()
 • SimpleLocationFeature.py
    Generate the business location feature from Latitude and Longitude. Just using k-means cluster.
    import numpy
    import json
    import math
    from scipy. cluster .vq import vq, kmeans, whiten,kmeans2
    \text{item}_f = \{\}
```

```
item_latitude=[]
        idx_latitude = \{\}
        item_longitude=[]
        idx_longitude={}
        item_location=[]
        idx\_location = \{\}
14
        feature\_count1 = 200
        feature\_count2 = 200
        feature\_count3 = 200
       \max v=0
        minv=100
        for line in open('../Data/yelp_training_set_business_s.json'):
                        js = json.loads(line)
                        item_latitude.append(js['latitude'])
24
                        item_longitude.append(js['longitude'])
                        item_location.append((js['latitude'], js['longitude']))
        for line in open('../Data/yelp_test_set_business_s.json'):
                        js = json.loads(line)
                        item_latitude.append(js['latitude'])
                        item_longitude.append(js['longitude'])
                        item_location.append((js['latitude'], js['longitude']))
        print 'load_over!'
        data_latitude = whiten(item_latitude)
        c_latitude = kmeans(data_latitude,feature_count1)[0]
         cat\_latitude = vq(data\_latitude, c\_latitude) [0]
        for i in range(len(item_latitude)):
                        idx_latitude [item_latitude [i]] = cat_latitude [i]
        print 'latitude _kmeans!'
       data_longitude = whiten(item_longitude)
        c_longitude = kmeans(data_longitude,feature_count2)[0]
        cat\_longitude = vq(data\_longitude, c\_longitude)[0]
        for i in range(len(item_longitude)):
                        idx\_longitude[item\_longitude[i]] = cat\_longitude[i]
        print 'longitude_kmeans!'
        data_location = whiten(item_location)
        c_location = kmeans(data_location,feature_count3)[0]
       cat\_location = vq(data\_location, c\_location)[0]
        for i in range(len(item_location)):
                        idx_location [(item_location[i]]0], item_location[i]] = cat_location[i]
        print 'location_kmeans!'
59
        for line in open('../Data/yelp_training_set_business_s.json'):
                        js = json.loads(line)
                        bid = js['business_id']
                        item_f[bid]=[idx_latitude [js['latitude']], idx_longitude [js['longitude']], idx_location [(js['latitude'], js['longitude'])
64
        for line in open('../Data/yelp_test_set_business_s.json'):
                        js = json.loads(line)
                        bid = js['business_id']
                        item_f[bid]=[idx_latitude [js ['latitude']], idx_longitude [js ['longitude']], idx_location [(js ['latitude'], js ['longitude']), idx_location [(js ['latitude'], js ['latitude']), idx_location [(js ['latitude'], js ['latitude'], idx_loca
                                  ]) ]]
69
        fout0 = open('../GlobalFeature/i/ItemLatitude.txt', 'w')
        fout1 = open('../GlobalFeature/i/ItemLongitude.txt','w')
        fout2 = open('../GlobalFeature/i/ItemLocation.txt','w')
```

```
74
    fout0.write('%d\n'%feature_count1)
    fout1.write('%d\n'%feature_count2)
    fout2.write('%d\n'%feature_count3)
    for item in item_f:
            fout 0. write('\%d\t\%d:1\n'\%(item,item\_f[item][0]))
            fout1.write('\%d\t\%d:1\n'\%(item,item\_f[item][1]))
            fout2.write('\%d\t\%d:1\n'\%(item,item\_f[item][2]))
   fout0.close()
    fout1.close()
    fout2.close()
 • Simple User Feature.py
    Generate the user feature from [yelp_training_set_user_json] and [yelp_test_set_user_json] directly, such as user review
    count.
    import numpy
    import json
    import math
    item_f = \{\}
    item_review_count={}
    \max v=0
   minv=100
    for line in open('../Data/yelp_training_set_user_s.json'):
            js = json.loads(line)
            bid = js['user\_id']
            log_review=math.log(js['review_count']+1,2)
            if log_review<minv:
                   minv=log_review
            if log_review>maxv:
                   maxv=log_review
19
            item_f[bid]=[log_review]
    for line in open('../Data/yelp_test_set_user_s.json'):
            js = json.loads(line)
24
            bid = js['user_id']
            log_review=math.log(js['review_count']+1,2)
            if log_review<minv:
                   minv=log_review
29
            if log_review>maxv:
                   maxv=log_review
            item_f[bid]=[log_review]
    fout1 = open('../GlobalFeature/u/UserReview.txt','w')
    fout1.write('%d\n'\%51)
    for item in item_f:
            fout 1. write('\%d\t\%d:1\n'\%((item,(item\_f[item][0]-minv)/(maxv-minv)*50)))
    fout1.close()
 • svdpp.py
    Generate SVD++ Feature.
    import numpy
    import json
    user_rated = \{\}
    \max v=0
```

```
for line in open('../Data/yelp_training_set_review_s.json'):
            js = json.loads(line)
            if js['business_id']>maxv:
                    maxv=js['business_id']
            if js['user_id'] in user_rated:
                    user_rated[js['user_id']]. append(js['business_id'])
            else:
13
                    user_rated[js['user_id']]=[js['business_id']]
    print maxv
    for line in open('../Data/yelp_test_set_review_s.json'):
            js = json.loads(line)
            if js ['business_id']>maxv:
                    maxv=js['business_id']
            if js['user_id'] in user_rated:
                    user_rated[js['user_id']]. append(js['business_id'])
23
            else:
                    user_rated[js['user_id']]=[js['business_id']]
    print maxv
    fout = open('../GlobalFeature/u/UserSVDpp.txt','w')
    fout.write('%d\n'%(maxv+1))
    for user in user_rated:
            fout.write('%d\t'%(user))
33
            for t in user_rated[user]:
                    fout.write('%d:%f\t'%(t,1.0/len(user_rated[user])))\#(t,1)
            fout.write('\n')
    fout.close()
 • svdppr.py
    Generate Reverse SVD++ Feature.
    import numpy
    import json
    business_rated={}
    \max v=0
    for line in open('../Data/yelp_training_set_review_s.json'):
            js = json.loads(line)
            if js ['user_id']>maxv:
                    maxv=js['user_id']
            if js['business_id'] in business_rated:
                    business_rated[js['business_id']].append(js['user_id'])
13
            else:
                    business_rated[js['business_id']]=[js['user_id']]
    print maxv
    for line in open('../Data/yelp_test_set_review_s.json'):
            js = json.loads(line)
            if js ['user_id']>maxv:
                    maxv=js['user_id']
            if js['business_id'] in business_rated:
                    business_rated[js['business_id']].append(js['user_id'])
23
            else:
                    business_rated [js ['business_id']]=[js ['user_id']]
    print maxv
28
    fout = open('../GlobalFeature/i/businessSVDpp.txt','w')
    fout.write('%d\n'%(maxv+1))
    for business in business_rated:
```

```
fout.write(\,{}^{,}\%d\backslash t\,{}^{,}\%(business))
33
            for t in business_rated[business]:
                    fout.write('%d:%f\t'%(t,(1.0/len(business_rated[business]))))
            fout.write('\n')
    fout.close()
 • UserAvgStar.py
    User average star feature.
    import numpy
    import json
   import math
    item_f = \{\}
    item\_star={}
    idx_star = 0
    \max v=0
    minv=100
    for line in open('../Data/yelp_training_set_user_s.json'):
            js = json.loads(line)
            bid = js['user\_id']
            item_f[bid]=js['average_stars']
    fout0 = open('../GlobalFeature/u/UserAvgStar.txt','w')
    fout0.write('%d\n'%(2))
    for item in range(51296):
        if item in item_f:
23
            fout0.write('\%d\t0:\%f\n'\%(item,item\_f[item]/5))
        else:
            fout0.write('%d\t1:1\n'%(item))
   fout0.close()
 • UserCat.py
    The business categories user rate.
    import numpy
   import json
    import math
    item_f = \{\}
    item_categories={}
    idx_cat = 0
    \max v=0
    minv=100
12
    def WordCount( wlist ):
        temp = \{\}
        for word in wlist:
            temp[word] = temp.get(word,0) + 1
        temp = sorted(temp.items(), key = lambda x:x[1], reverse = True)
        return temp[1:]
    for line in open('../Data/yelp_training_set_business_s.json'):
        js = json.loads(line)
        bid = js['business_id']
22
        for c in js['categories']:
             if c not in item_categories:
                item_categories [c]=idx_cat
                idx_cat += 1
        item_f[bid]=[item_categories[c] for c in js['categories']]
27
```

```
print 'categories:%d'%idx_cat
    for line in open('../Data/yelp_test_set_business_s.json'):
        js = json.loads(line)
32
        bid = js['business_id']
        for c in js['categories']:
            if c not in item_categories:
                item_categories [c]=idx_cat
                idx_cat += 1
        item_f[bid]=[item_categories[c] for c in js['categories']]
    print 'categories:%d'%idx_cat
   UserCate = \{\}
    for line in open('../Data/yelp_training_set_review_s.json'):
        js = json.loads(line)
        uid = js['user\_id']
        bid = js['business_id']
47
        cid = item_f[bid]
        if uid in UserCate:
            UserCate[uid]+=cid
        else:
            UserCate[uid]=cid[:]
52
    for line in open('../Data/yelp_test_set_review_s.json'):
        js = json.loads(line)
        uid = js['user\_id']
        bid = js['business_id']
        cid = item_f[bid]
        if uid in UserCate:
            UserCate[uid]+=cid
        else:
            UserCate[uid]=cid[:]
62
    fout3 = open('../GlobalFeature/u/UserCategories.txt','w')
    fout3.write('%d\n'%(idx_cat))
67
    for user in UserCate:
        Top = WordCount(UserCate[user])
        fout 3. write('\%d\t\%s\n'\%(user,'\t'.join(['\%d:1'\%x[0] for x in Top])))
   fout3.close()
 • UserGender.py
    User gender feature.
    import numpy
    import json
    UserGenderMap={}
    NameGenderMap={}
    for line in open('NameGender.txt'):
            line = line. split ('\t')
            NameGenderMap[line[0].lower()] = line[1].rstrip()
    for line in open('../Data/yelp_training_set_user_s.json'):
            js = json.loads(line)
            userid = js['user_id']
13
            username = js['name'].lower()
            if username in NameGenderMap:
                    UserGenderMap[userid] = NameGenderMap[username]
    for line in open('../Data/yelp_test_set_user_s .json'):
            js = json.loads(line)
            userid = js['user_id']
```

```
username = js['name'].lower()
           if username in NameGenderMap:
                   UserGenderMap[userid]=NameGenderMap[username]
23
   fout = open('../GlobalFeature/u/UserGender.txt','w')
   fout.write('%d\n'\%(3))
   for user in range(55965):
           fout.write('%d\t'%(user))
28
           if user in UserGenderMap:
                   if UserGenderMap[user]=='m':
                           fout.write('0:1\n')
                   elif UserGenderMap[user]=='f':
                           fout.write('1:1\n')
33
           else:
                   fout.write('2:1\n')
   fout.close()
 • UserName.py
   User name feature.
   import numpy
   import json
   UserMap = \{\}
   NameMap={}
   idx=0
   for line in open('../Data/yelp_training_set_user_s.json'):
       js = json.loads(line)
       userid = js['user_id']
       username = js['name'].lower()
       if username not in NameMap:
           NameMap[username]=idx
           idx += 1
       UserMap[userid]=NameMap[username]
   for line in open('../Data/yelp_test_set_user_s.json'):
       js = json.loads(line)
19
       userid = js['user_id']
       username = js['name'].lower()
       if username not in NameMap:
           NameMap[username] = idx
           idx+=1
24
       UserMap[userid]=NameMap[username]
   fout = open('../GlobalFeature/u/UserName.txt','w')
   fout.write('%d\n'\%(idx))
   for user in UserMap:
       fout.write('%d\t%d:1\n'%(user,UserMap[user]))
   fout.close()
 • UserNameLen.py
   Length of user name feature.
   import numpy
   import json
   UserMap = \{\}
   NameMap={}
   idx=0
   for line in open('../Data/yelp_training_set_user_s.json'):
       js = json.loads(line)
       userid = js['user_id']
       username = len(js['name'].lower())
       if username not in NameMap:
           NameMap[username]=idx
14
```

```
idx += 1
        UserMap[userid]=NameMap[username]
    for line in open('../Data/yelp_test_set_user_s.json'):
        js = json.loads(line)
19
        userid = js['user_id']
        username = len(js['name'].lower())
        if username not in NameMap:
            NameMap[username] = idx
            idx+=1
        UserMap[userid]=NameMap[username]
    fout = open('../GlobalFeature/u/UserNameLen.txt','w')
    fout.write('%d\n'%(idx))
    for user in UserMap:
        fout.write(\,{}^{,}\%d\backslash t\%d:1\backslash n'\%(user,UserMap[user]))
    fout.close()

    makelibfm1.py

    Make LibFM formate feature with bid and uid.
    import sys
    import os
    import json
    print '-----Make_libFM_Feature-----
    info=open('Data/info.txt')
    user_count=int(info.readline())
   item_count=int(info.readline())
    info.close()
    num\_factor = int(sys.argv[2])
    num\_round = int(sys.argv[3])
14
    group_info=[]
    #From directories load features
    def AppendFromDir(path,base_count):
            f_map={}
19
            feature\_count{=}0
            for file in os. listdir (path):
                    header=True
                    base_count+=feature_count
                     for line in open(path+file):
24
                             if header:
                                     feature_count=int(line)
                                     group_info.append(feature_count)
                                     header=False
                             else:
29
                                     line = line. split('\t')
                                     idx = int(line [0])
                                      flist = \{\}
                                      for f in line [1:]:
                                              if f.rstrip().lstrip()=="":continue
34
                                              x = f. split (':')
                                              \mathbf{x} = [\operatorname{int}(\mathbf{x}[0]), \operatorname{float}(\mathbf{x}[1])]
                                              flist [x[0]+base\_count]=x[1]
                                      if idx in f_map:
                                              f_map[idx].update(flist)
39
                                     else:
                                              f_{map}[idx] = flist
            return f_map,base_count+feature_count
   def AppendFromDirUI(path,base_count):
            f_map={}
            feature\_count=0
            for file in os. listdir (path):
```

```
header=True
                                                                  base\_count += feature\_count
   49
                                                                    for line in open(path+file):
                                                                                              if header:
                                                                                                                       feature_count=int(line)
                                                                                                                       group_info.append(feature_count)
                                                                                                                       header=False
  54
                                                                                              else:
                                                                                                                       line = line. split ('\t')
                                                                                                                       idx = (int(line [0]), int(line [1]))
                                                                                                                         flist = \{\}
                                                                                                                        for f in line [2:]:
  59
                                                                                                                                                  if f.rstrip().lstrip()=="":continue
                                                                                                                                                 x = f. split(':')
                                                                                                                                                 \mathbf{x} = [\operatorname{int}(\mathbf{x}[0]), \operatorname{float}(\mathbf{x}[1])]
                                                                                                                                                   flist [x[0]+base\_count]=x[1]
                                                                                                                        if idx in f_map:
  64
                                                                                                                                                 f_map[idx].update(flist)
                                                                                                                       else:
                                                                                                                                                 f_{map}[idx] = flist
                                         return f_map,base_count+feature_count
                 global_f = 1
               user_f = 0
               item_f=0
               #Global Feature
               Global_Feature_u, global_f=AppendFromDir('GlobalFeature/u/',user_count+item_count)
               Global_Feature_i, global_f = AppendFromDir('GlobalFeature/i/',global_f)
               Global_Feature_ui, global_f = AppendFromDirUI('GlobalFeature/ui/',global_f)
               print 'Global_Feature_Count:%d'%global_f
               #User Feature
               User_Feature, global_f = AppendFromDir('UserFeature/', global_f)
               print 'User_Feature_Count:%d'%global_f
               #Item Feature
               Item_Feature, global_f=AppendFromDir('ItemFeature/',global_f)
               print 'Item_Feature_Count:%d'%global_f
                 global_f_c = 0
                 user_f_c = 1
               item_f_c=1
                   global_f_list = []
                  user_f_list = []
                 item_f_list = []
               global_f_v = []
                user_f_v = []
               item_f_v=[]
                ftrain = open('Result/'+sys.argv[1]+'/global.train.libfm', 'w')
               for line in open('Data/training_data.txt'):
                                          line = map(int, map(float, line. split('\t')))
                                         u, i, r = line
                                          #generate global feature
                                           global\_f_c = len(Global\_Feature\_u.get(u,\{\})) + len(Global\_Feature\_i.get(i,\{\})) + len(Global\_Feature\_ui.get((u,i),\{\})) + len(Global\_Fe
                                            global\_feature\_i.get(i,\{\}).keys() + Global\_Feature\_i.get(i,\{\}).keys() + Global\_Feature\_i.get((u,i),\{\}).keys() + Global\_Featu
104
                                           global\_feature\_i.get(i, \{\}).values() + Global\_feature\_i.get(i, \{\}).values() + Global\_feature\_ui.get((u, i), \{\}).
                                                         values()
                                          #generate user feature
                                           user_f_c = 1 + len(User_Feature.get(u, {}))
                                            user_flist = [u] + User_Feature.get(u, {}).keys()
                                           user_f_v = [1] + User_Feature.get(u, {}).values()
109
                                          #generate item feature
                                          item_f_c=1+len(Item_Feature.get(i,{}))
                                           item_f_list = [i + user_count] + Item_F_eature.get(i, {}).keys()
                                         item_f_v=[1]+Item_Feature.get(i,{}).values()
```

```
114
                             ftrain .write('\%d_{-}\%(r))
                             for j in range(user_f_c):
                                               ftrain . write('%d:%.3f_'%(user_f_list[j], user_f_v[j]))
                             for i in range(item_f_c):
119
                                               ftrain.write(\,{}^{\prime}\%d:\%.3f_{-}{}^{\prime}\%(item\_f\_list\,[\,j\,\,],\,item\_f\_v\,[\,j\,\,])\,)
                             for j in range(global_f_c):
                                               ftrain.write(\,{}^{,}\%d:\%.3f\_{}^{,}\%(\,global\_f\_list\,[\,j\,],\,global\_f\_v\,[\,j\,])\,)
                             ftrain . write('\n')
124
           ftrain.close()
           print 'Generate_Training_Over.'
           ftest = open('Result/'+sys.argv[1]+'/global.test.libfm', 'w')
           for line in open('Data/testing_data.txt'):
                             line = map(int, map(float, line. split('\t')))
                             u,i,r=line
                             #generate global feature
                              global.f.c = len(Global.Feature\_u.get(u,\{\})) + len(Global.Feature\_i.get(i,\{\})) + len(Global.Feature\_ui.get((u,i),\{\}))
134
                               global\_feature\_i.get(i,\{\}).keys() + Global\_feature\_i.get(i,\{\}).keys() + Global\_feature\_i.get((u,i),\{\}).keys() + Global\_featu
                              global\_feature\_i.get(i, \{\}).values() + Global\_feature\_i.get(i, \{\}).values() + Global\_feature\_ui.get((u, i), \{\}).
                                        values()
                             #generate user feature
                              user_f_c = 1 + len(User_Feature.get(u, {}))
                              user\_f\_list = [u] + User\_Feature.get(u, \{\}).keys()
139
                              user_f_v = [1] + User_Feature.get(u, {}).values()
                              #generate item feature
                             item_f_c = 1 + len(Item_Feature.get(i, {}))
                              item_f_list = [i + user_count] + Item_F_eature.get(i, {}).keys()
                             item_f_v=[1]+Item_Feature.get(i,{}).values()
144
                             ftest .write('\%d_{-}\%(r))
                             for j in range(user_f_c):
                                               ftest .write('%d:%.3f_'%(user_f_list[j], user_f_v[j]))
149
                             for j in range(item_f_c):
                                               ftest .write('%d:%.3f_'%(item_f_list[j], item_f_v[j]))
                             for j in range(global_f_c):
                                               ftest .write('%d:%.3f_'%(global_f_list [j], global_f_v [j]))
154
                              ftest .write('\n')
           ftest.close()
           print 'Generate_Testing_Over.'
159
           fmeta = open('Result/'+sys.argv[1]+'/meta.txt','w')
           group_idx=0
           for i in range(user_count):
                             fmeta.write('%d\n'%group_idx)
164
           group\_idx{+}{=}1
           for i in range(item_count):
                             fmeta.write('%d\n'%group_idx)
          group_idx += 1
169
           for i in group_info:
                             for j in range(i):
                                              fmeta.write('%d\n'%group_idx)
                             group\_idx+=1
174
           fmeta.close()
           print 'Generate_Meta_Over.'
```

#Generate Run.bat

```
bat = open('Result/'+sys.argv[1]+'/run.bat','w')
   bat.write(r "
    "../../ Lab/libfm.exe" -task r -train global.train.libfm -test global.test.libfm -dim '1,1,%d' -iter %d -method mcmc -
    " %(num_factor,num_round))
   bat.write(r
   python "../../Lab/CatFile.py" "../../Data/Local/%1/Submit.txt" "StepResult/pred.txt"
   bat.write('pause')
   bat.close()
   print '-----'
 • makelibfm2.py
   Make LibFM formate feature with uid but without bid.
   import sys
   import os
   import json
   print '------'Make_libFM_Feature-----'
   info=open('Data/info.txt')
   user_count=int(info.readline())
   item_count=int(info.readline())
   info.close()
   num_factor = int(sys.argv[2])
   num\_round = int(sys.argv[3])
13
   group_info=[]
    #From directories load features
   def AppendFromDir(path,base_count):
           f_map={}
           feature\_count{=}0
           for file in os. listdir (path):
                   header=True
                   base_count+=feature_count
23
                    for line in open(path+file):
                            if header:
                                    feature_count=int(line)
                                    group_info.append(feature_count)
                                    header=False
28
                            else:
                                    line = line. split('\t')
                                    idx = int(line [0])
                                    flist = \{\}
                                    for f in line [1:]:
33
                                            if f.rstrip().lstrip()=="":continue
                                            x = f. split (':')
                                            \mathbf{x} = [\operatorname{int}(\mathbf{x}[0]), \operatorname{float}(\mathbf{x}[1])]
                                            flist [x[0]+base\_count]=x[1]
                                    if idx in f_map:
38
                                            f_map[idx].update(flist)
                                    else:
                                            f_{-map}[idx] = flist
           return f_map,base_count+feature_count
   def AppendFromDirUI(path,base_count):
           f_map={}
           feature_count=0
            for file in os. listdir (path):
                   header=True
48
                   base_count+=feature_count
```

for line in open(path+file):

```
if header:
                                                                                                                       feature_count=int(line)
                                                                                                                       group_info.append(feature_count)
                                                                                                                       header=False
                                                                                              else:
                                                                                                                       line = line. split ('\t')
                                                                                                                       idx = (int(line [0]), int(line [1]))
                                                                                                                         flist = \{\}
                                                                                                                       for f in line [2:]:
                                                                                                                                                 if f.rstrip().lstrip()=="":continue
                                                                                                                                                 x = f. split (':')
                                                                                                                                                 \mathbf{x} = [\operatorname{int}(\mathbf{x}[0]), \operatorname{float}(\mathbf{x}[1])]
                                                                                                                                                  flist [x[0]+base\_count]=x[1]
  63
                                                                                                                        if idx in f_map:
                                                                                                                                                 f_map[idx].update(flist)
                                                                                                                        else:
                                                                                                                                                 f_{-}map[idx] = flist
                                         return f_map,base_count+feature_count
  68
                global_f = 0
                user_f = 0
               item_f=0
                #Global Feature
               Global_Feature_u, global_f=AppendFromDir('GlobalFeature/u/',user_count)
               Global_Feature_i, global_f = AppendFromDir('GlobalFeature/i/',global_f)
               Global_Feature_ui, global_f = AppendFromDirUI('GlobalFeature/ui/',global_f)
               print 'Global_Feature_Count:%d'%global_f
                #User Feature
               User_Feature, global_f = AppendFromDir('UserFeature/',global_f)
               print 'User_Feature_Count:%d'%global_f
                #Item Feature
              Item_Feature, global_f=AppendFromDir('ItemFeature/',global_f)
               print 'Item_Feature_Count:%d'%global_f
                 global_f_c = 0
                user_f_c = 1
               item_f_c=1
                  global\_f\_list = []
                  user_f_list = []
                 item_f_list = []
                global_f_v = []
                user_f_v = []
               item_f_v=[]
               ftrain = open('Result/'+sys.argv[1]+'/global.train.libfm', 'w')
               for line in open('Data/training_data.txt'):
                                          line = map(int, map(float, line. split('\t')))
                                         u, i, r = line
                                          #generate global feature
                                           global.f.c = len(Global.Feature\_u.get(u,\{\})) + len(Global.Feature\_i.get(i,\{\})) + len(Global.Feature\_ui.get((u,i),\{\}))
103
                                            global\_feature\_i.get(i,\{\}).keys() + Global\_feature\_i.get(i,\{\}).keys() + Global\_feature\_i.get((u,i),\{\}).keys() + Global\_featu
                                           global_{v} = Global_{v} = Global_{v} = Global_{v} = get(u, {}).values() + Global_{v}
                                                         values()
                                          #generate user feature
                                           user_f_c = 1 + len(User_Feature.get(u, {}))
                                           user_f_list = [u] + User_F_eature.get(u, {}).keys()
108
                                           user_f_v = [1] + User_Feature.get(u, {}).values()
                                           #generate item feature
                                          item_f_c = len(Item_Feature.get(i, {}))
                                           item_f_list = Item_F_eature.get(i, {}).keys()
                                          item_f_v=Item_Feature.get(i,{}).values()
113
                                          ftrain .write('\%d_{-}\%(r))
```

```
for j in range(user_f_c):
                                             ftrain .write('%d:%.3f_'%(user_f_list[j], user_f_v[j]))
118
                           for j in range(item_f_c):
                                             ftrain . write('%d:%.3f_'%(item_f_list[j], item_f_v[j]))
                           for j in range(global_f_c):
                                             ftrain .write('%d:%.3f_'%(global_f_list[j], global_f_v[j]))
123
                           ftrain .write('\n')
          ftrain.close()
          print 'Generate_Training_Over.'
128
           ftest = open('Result/'+sys.argv[1]+'/global.test.libfm', 'w')
          for line in open('Data/testing_data.txt'):
                           line = map(int, map(float, line. split('\t')))
                           u, i, r = line
                           #generate global feature
133
                            global f_c = len(Global Feature\_u.get(u, \{\})) + len(Global Feature\_i.get(i, \{\})) + len(Global Feature\_ui.get((u, i), \{\}))
                             global\_feature\_i.get(i,\{\}).keys() + Global\_feature\_i.get(i,\{\}).keys() + Global\_feature\_i.get((u,i),\{\}).keys() + Global\_featu
                            global\_feature\_i.get(i, \{\}).values() + Global\_feature\_i.get(i, \{\}).values() + Global\_feature\_ui.get((u, i), \{\}).
                                     values()
                            #generate user feature
                            user_f_c = 1 + len(User_Feature.get(u, {}))
138
                            user_f_list = [u] + User_F_eature.get(u, {}).keys()
                            user_f_v = [1] + User_Feature.get(u, {}).values()
                            #generate item feature
                           item_f_c = len(Item_Feature.get(i, {}))
                            item_f_list = Item_Feature.get(i, {}).keys()
143
                           item_f_v = Item_Feature.get(i, \{\}).values()
                            ftest .write('\%d_{-}'\%(r))
                           for j in range(user_f_c):
148
                                             ftest . write('%d:%.3f_'%(user_f_list[j], user_f_v[j]))
                           for j in range(item_f_c):
                                             ftest .write('%d:%.3f_'%(item_f_list[j], item_f_v[j]))
                           for j in range(global_f_c):
                                             ftest .write('%d:%.3f_'%(global_f_list[j], global_f_v[j]))
153
                            ftest .write('\n')
           ftest . close ()
          print 'Generate_Testing_Over.'
158
          fmeta = open('Result/'+sys.argv[1]+'/meta.txt','w')
          group_idx=0
          for i in range(user_count):
                           fmeta.write('%d\n'%group_idx)
          group_idx += 1
          for i in range(item_count):
                           fmeta.write('\%d\n'\%group\_idx)
168
          group_idx += 1
          for i in group_info:
                           for j in range(i):
                                           fmeta.write('%d\n'%group_idx)
173
                           group\_idx+=1
          fmeta.close()
          print 'Generate_Meta_Over.'
178
          #Generate Run.bat
          bat = open('Result/'+sys.argv[1]+'/run.bat','w')
           "../../ Lab/libfm.exe" -task r -train global.train.libfm -test global.test.libfm -dim '1,1,%d' -iter %d -method sgd -
```

```
learn_rate 0.001 -regular '0,0,5' -init_stdev 0.05 -out StepResult/pred.txt
     " %(num_factor,num_round))
    bat.write(r '''
    python "../../Lab/CatFile.py" "../../Data/Local/%1/Submit.txt" "StepResult/pred.txt"
188
    bat.close()
    print '------'
  • makelibfm3.py
    Make LibFM formate feature with bid but without uid.
    import sys
    import os
    import json
    print '------'
    info=open('Data/info.txt')
    user_count=int(info.readline())
    item_count=int(info.readline())
    info.close()
    num_factor = int(sys.argv[2])
    num\_round = int(sys.argv[3])
    group_info=[]
    #From directories load features
    def AppendFromDir(path,base_count):
            f_map={}
19
            feature\_count{=}0
            for file in os. listdir (path):
                    header=True
                    base_count+=feature_count
                    for line in open(path+file):
24
                            if header:
                                    feature_count=int(line)
                                    group_info.append(feature_count)
                                    header=False
                            else:
29
                                    line = line. split ('\t')
                                    idx = int(line [0])
                                     flist = \{\}
                                    for f in line [1:]:
                                            if f.rstrip().lstrip()=="":continue
34
                                            x = f. split(':')
                                            \mathbf{x} = [\operatorname{int}(\mathbf{x}[0]), \operatorname{float}(\mathbf{x}[1])]
                                            flist [x[0]+base\_count]=x[1]
                                    if idx in f_map:
                                            f_map[idx].update(flist)
39
                                    else:
                                            f_{-}map[idx] = flist
            return f_map,base_count+feature_count
    def AppendFromDirUI(path,base_count):
            f_map={}
            feature\_count=0
            for file in os. listdir (path):
                    header=True
                    base_count+=feature_count
49
                    for line in open(path+file):
                            if header:
                                    feature_count=int(line)
                                    group_info.append(feature_count)
                                    header=False
54
```

```
else:
                                                                                                                        line = line. split ('\t')
                                                                                                                        idx = (int(line [0]), int(line [1]))
                                                                                                                         flist = \{\}
                                                                                                                        for f in line [2:]:
  59
                                                                                                                                                  if f.rstrip().lstrip()=="": continue
                                                                                                                                                  x = f. split (':')
                                                                                                                                                  \mathbf{x} = [\operatorname{int}(\mathbf{x}[0]), \operatorname{float}(\mathbf{x}[1])]
                                                                                                                                                   flist [x[0]+base\_count]=x[1]
                                                                                                                        if idx in f_map:
                                                                                                                                                  f_map[idx].update(flist)
                                                                                                                        else:
                                                                                                                                                  f_{-}map[idx] = flist
                                         return f_map,base_count+feature_count
  69
                global_f = 0
                user_f = 0
               item_f=0
               #Global Feature
               Global_Feature_u, global_f=AppendFromDir('GlobalFeature/u/',item_count)
               Global_Feature_i, global_f = AppendFromDir('GlobalFeature/i/',global_f)
               Global_Feature_ui, global_f = AppendFromDirUI('GlobalFeature/ui/',global_f)
               print 'Global_Feature_Count:%d'%global_f
               #User Feature
               User_Feature, global_f = AppendFromDir('UserFeature/', global_f)
               print 'User_Feature_Count:%d'%global_f
                #Item Feature
               Item_Feature, global_f=AppendFromDir('ItemFeature/',global_f)
               print 'Item_Feature_Count:%d'%global_f
                 global_f_c = 0
                 user_f_c = 1
               item\_f\_c\!=\!1
                  global_flist = []
                  user_f_list = []
                 item_f_list = []
               global_f_v = []
               user_f_v = []
               item_f_v=[]
                ftrain = open('Result/'+sys.argv[1]+'/global.train.libfm', 'w')
               for line in open('Data/training_data.txt'):
                                          line = map(int, map(float, line. split('\t')))
                                         u,i,r=line
                                          #generate global feature
                                           global\_f_c = len(Global\_Feature\_u.get(u,\{\})) + len(Global\_Feature\_i.get(i,\{\})) + len(Global\_Feature\_ui.get((u,i),\{\})) + len(Global\_Fe
                                            global\_feature\_i.get(i,\{\}).keys() + Global\_feature\_i.get(i,\{\}).keys() + Global\_feature\_i.get((u,i),\{\}).keys() + Global\_featu
104
                                           global\_feature\_i.get(i,\{\}).values()+Global\_feature\_i.get(i,\{\}).values()+Global\_feature\_ui.get((u,i),\{\}).
                                                         values()
                                           #generate user feature
                                           user_f_c = len(User_Feature.get(u, {}))
                                            user_f_list = User_F_eature.get(u,{}).keys()
                                           user_f_v = User_Feature.get(u, {}).values()
109
                                           #generate item feature
                                          item_f_c=1+len(Item_Feature.get(i,{}))
                                           item_f_list = [i] + Item_Feature.get(i, {}).keys()
                                         item\_f\_v = [1] + Item\_Feature.get(i, \{\}).values()
114
                                          ftrain.write('%d_'%(r))
                                          for j in range(user_f_c):
                                                                    ftrain .write('%d:%.3f_'%(user_f_list[j], user_f_v[j]))
                                          for j in range(item_f_c):
119
                                                                    ftrain.write('\%d:\%.3f_-'\%(item_f_list[j], item_f_v[j]))
```

```
for j in range(global_f_c):
                      ftrain .write('%d:%.3f_'%(global_f_list[j], global_f_v[j]))
             ftrain .write('\n')
124
     ftrain.close()
     print 'Generate_Training_Over.'
     ftest = open('Result/'+sys.argv[1]+'/global.test.libfm', 'w')
129
     for line in open('Data/testing_data.txt'):
             line = map(int, map(float, line. split('\t')))
             u,i,r=line
             #generate global feature
              global.f.c = len(Global.Feature\_u.get(u,\{\})) + len(Global.Feature\_i.get(i,\{\})) + len(Global.Feature\_ui.get((u,i),\{\}))
134
              global\_flist = Global\_Feature\_u.get(u, \{\}).keys() + Global\_Feature\_i.get(i, \{\}).keys() + Global\_Feature\_ui.get((u, i), \{\}).
              global\_feature\_u.get(u,\{\}).values()+Global\_feature\_i.get(i,\{\}).values()+Global\_feature\_ui.get((u,i),\{\}).
                  values()
             #generate user feature
              user_f_c = len(User_Feature.get(u, {}))
              user_flist = User_Feature.get(u, {}).keys()
139
              user_f_v = User_Feature.get(u, \{\}).values()
             #generate item feature
             item_f_c=1+len(Item_Feature.get(i,\{\}))
              item_f_list = [i] + Item_Feature.get(i, {}).keys()
             item_f_v=[1]+Item_Feature.get(i,\{\}).values()
144
             ftest .write('\%d_-'%(r))
             for j in range(user_f_c):
                      ftest .write('%d:%.3f_'%(user_f_list[j], user_f_v[j]))
149
             for j in range(item_f_c):
                      ftest .write('%d:%.3f_'%(item_f_list[j], item_f_v[j]))
             for j in range(global_f_c):
                      ftest .write('%d:%.3f_'%(global_f_list[j], global_f_v[j]))
154
             ftest .write('\n')
     ftest . close ()
     print 'Generate_Testing_Over.'
159
     fmeta = open('Result/'+sys.argv[1]+'/meta.txt','w')
     group_idx=0
     for i in range(user_count):
             fmeta.write('\%d\n'\%group\_idx)
164
     group_idx += 1
     for i in range(item_count):
             fmeta.write('%d\n'%group_idx)
    group\_idx+=1
169
     for i in group_info:
             for j in range(i):
                     fmeta.write('%d\n'%group_idx)
             group_idx += 1
     fmeta.close()
     print 'Generate_Meta_Over.'
    #Generate Run.bat
     bat = open('Result/'+sys.argv[1]+'/run.bat','w')
     bat.write(r
     "../../ Lab/libfm.exe" -task r -train global.train.libfm -test global.test.libfm -dim '1,1,%d' -iter %d -method sgd -
         learn_rate 0.001 -regular '0,0,5' -init_stdev 0.05 -out StepResult/pred.txt
     " %(num_factor,num_round))
184
     bat.write(r "
```

```
python "../../Lab/CatFile.py" "../../Data/Local/%1/Submit.txt" "StepResult/pred.txt"
    #bat.write('pause')
189
    bat.close()
    print '-----'
  • makelibfm4.py
    Make LibFM formate feature with out bid and uid.
    import sys
    import os
    import json
    print '----Make_libFM_Feature-----'
    info=open('Data/info.txt')
    user_count=int(info.readline())
    item_count=int(info.readline())
    info.close()
    num_factor = int(sys.argv[2])
    num\_round = int(sys.argv[3])
13
    group_info=[]
    #From directories load features
    def AppendFromDir(path,base_count):
            f_map={}
            feature\_count=0
            for file in os. listdir (path):
                    header=True
                    base_count+=feature_count
23
                    for line in open(path+file):
                            if header:
                                    feature_count=int(line)
                                    group_info.append(feature_count)
                                    header=False
28
                            else:
                                    line = line. split('\t')
                                    idx = int(line [0])
                                    flist = \{\}
                                    for f in line [1:]:
33
                                            if f.rstrip().lstrip()=="":continue
                                            x = f. split (':')
                                            \mathbf{x} = [int(\mathbf{x}[0]), float(\mathbf{x}[1])]
                                            flist [x[0]+base\_count]=x[1]
38
                                    if idx in f_map:
                                            f_map[idx].update(flist)
                                    else:
                                            f_{map}[idx] = flist
            return f_map,base_count+feature_count
    def AppendFromDirUI(path,base_count):
            f_map={}
            feature\_count=0
            for file in os. listdir (path):
                    header=True
48
                    base_count+=feature_count
                    for line in open(path+file):
                            if header:
                                    feature_count=int(line)
                                    group_info.append(feature_count)
53
                                    header=False
                            else:
                                    line = line. split ('\t')
                                    idx = (int(line [0]), int(line [1]))
```

```
flist = \{\}
  58
                                                                                                                       for f in line [2:]:
                                                                                                                                                  if f.rstrip().lstrip()=="":continue
                                                                                                                                                 x = f. split (':')
                                                                                                                                                 \mathbf{x} = [\operatorname{int}(\mathbf{x}[0]), \operatorname{float}(\mathbf{x}[1])]
                                                                                                                                                  flist [x[0]+base\_count]=x[1]
  63
                                                                                                                       if idx in f_map:
                                                                                                                                                 f_map[idx].update(flist)
                                                                                                                       else:
                                                                                                                                                 f_{map}[idx] = flist
                                         return f_map,base_count+feature_count
  68
                global_f = 0
               user_f = 0
               item_f=0
                #Global Feature
               Global_Feature_u, global_f=AppendFromDir('GlobalFeature/u/',0)
               Global_Feature_i, global_f = AppendFromDir('GlobalFeature/i/',global_f)
               Global_Feature_ui, global_f = AppendFromDirUI('GlobalFeature/ui/',global_f)
               print 'Global_Feature_Count:%d'%global_f
               #User Feature
               User_Feature, global_f = AppendFromDir('UserFeature/',global_f)
               print 'User_Feature_Count:%d'%global_f
              Item_Feature, global_f=AppendFromDir('ItemFeature/',global_f)
               print 'Item_Feature_Count:%d'%global_f
                global_f_c = 0
                user_f_c = 1
               item_f_c=1
                  global_flist = []
                  user_f_list = []
                 item_f_list = []
                global_f_v = []
                user_f_v = []
               item_f_v=[]
               ftrain = open('Result/'+sys.argv[1]+'/global.train.libfm', 'w')
               for line in open('Data/training_data.txt'):
                                          line = map(int,map(float,line.split('\t')))
                                         u, i, r = line
                                          #generate global feature
                                           global f_c = len(Global feature\_u.get(u, \{\})) + len(Global feature\_i.get(i, \{\})) + len(Global feature\_u.get((u, i), \{\}))
103
                                            global\_feature\_i.get(i,\{\}).keys() + Global\_feature\_i.get(i,\{\}).keys() + Global\_feature\_i.get((u,i),\{\}).keys() + Global\_featu
                                           global\_feature\_i.get(i,\{\}).values() + Global\_feature\_i.get(i,\{\}).values() + Global\_feature\_ui.get((u,i),\{\}).values() + Global\_feature\_ui.get((u,i),\{\}).v
                                                         values()
                                          #generate user feature
                                           user_f_c = len(User_Feature.get(u, {}))
                                           user_f_list = User_F_eature.get(u, {}).keys()
108
                                           user_f_v = User_Feature.get(u, {}).values()
                                           #generate item feature
                                          item_f_c = len(Item_Feature.get(i, {}))
                                           item_f_list = Item_F_eature.get(i, {}).keys()
                                          item_f_v=Item_Feature.get(i,{}).values()
113
                                          ftrain.write('\%d_-'\%(r))
                                          for j in range(user_f_c):
                                                                    ftrain .write('%d:%.3f_'%(user_f_list[j], user_f_v[j]))
118
                                          for j in range(item_f_c):
                                                                    ftrain .write('%d:%.3f_'%(item_f_list[j], item_f_v[j]))
                                          for j in range(global_f_c):
                                                                    ftrain .write('%d:%.3f_'%(global_f_list[j], global_f_v[j]))
                                          ftrain.write('\n')
123
```

```
ftrain.close()
          print 'Generate_Training_Over.'
128
           ftest = open('Result/'+sys.argv[1]+'/global.test.libfm', 'w')
          for line in open('Data/testing_data.txt'):
                           line = map(int, map(float, line. split('\t')))
                           u,i,r=line
                           #generate global feature
133
                            global f_c = len(Global feature u.get(u, \{\})) + len(Global feature i.get(i, \{\})) + len(Global feature u.get((u, i), \{\}))
                             global\_feature\_i.get(i, \{\}).keys() + Global\_feature\_i.get(i, \{\}).keys() + Global\_feature\_i.get((u, i), \{\}).keys(
                            global f_v = Global Feature u.get(u, \{\}).values() + Global Feature i.get(i, \{\}).values() + Global Feature u.get((u, i), \{\}).
                                      values()
                            #generate user feature
                            user_f_c = len(User_Feature.get(u, \{\}))
138
                             user_f_list = User_F_eature.get(u, {}).keys()
                            user_f_v = User_Feature.get(u, {}).values()
                            #generate item feature
                           item\_f\_c = len(Item\_Feature.get(i,\{\}))
                            item_f_list = Item_Feature.get(i,{}).keys()
143
                           item_fv=Item_Feature.get(i,{}).values()
                            ftest .write('\%d_{-}'\%(r))
                           for j in range(user_f_c):
148
                                             ftest .write('%d:%.3f_'%(user_f_list[j], user_f_v[j]))
                           for j in range(item_f_c):
                                             ftest . write('%d:%.3f_'%(item_f_list[j], item_f_v[j]))
                           for j in range(global_f_c):
                                             ftest .write('%d:%.3f_'%(global_f_list[j], global_f_v[j]))
153
                            ftest .write('\n')
           ftest . close ()
          print 'Generate_Testing_Over.'
          fmeta = open('Result/'+sys.argv[1]+'/meta.txt','w')
          group_idx=0
          for i in range(user_count):
                           fmeta.write('\%d\n'\%group\_idx)
          group_idx += 1
          for i in range(item_count):
                           fmeta.write('%d\n'%group_idx)
168
          group_idx += 1
          for i in group_info:
                           for j in range(i):
                                            fmeta.write('%d\n'%group_idx)
173
                           group_idx += 1
          fmeta.close()
          print 'Generate_Meta_Over.'
178
          #Generate Run.bat
          bat = open('Result/'+sys.argv[1]+'/run.bat','w')
          bat.write(r
             '../../ Lab/libfm.exe" -task r -train global.train.libfm -test global.test.libfm -dim '1,1,%d' -iter %d -method sgd -
                    learn_rate 0.001 -regular '0,0,5' -init_stdev 0.05 -out StepResult/pred.txt
           ^{""}\% (num\_factor, num\_round))
          bat.write(r "
          python "../../Lab/CatFile.py" "../../Data/Local/%1/Submit.txt" "StepResult/pred.txt"
            ··· )
          #bat.write('pause')
```

```
bat.close()
    print '----Make_libFM_Feature-----
 • makesvdfeature.py
    Make SVDFeature formate feature with uid and bid.
    import sys
    import os
   import json
    print '------Make_svdFeature_Feature-----'
    info=open('Data/info.txt')
    user_count=int(info.readline())
    item_count=int(info.readline())
    info.close()
    num\_factor = int(sys.argv[2])
   num\_round = int(sys.argv[3])
    def AppendFromDir(path,base_count):
            f_map={}
            feature\_count=0
             for file in os. listdir (path):
                     header=True
                     base\_count+=feature\_count
                     for line in open(path+file):
                              if header:
                                      feature_count=int(line)
23
                                      header=False
                              else:
                                      line = line. split('\t')
                                      idx = int(line [0])
                                       flist = \{\}
                                      for f in line [1:]:
                                               if f.rstrip().lstrip()=="":continue
                                               x = f. split(':')
                                               \mathbf{x} = [\operatorname{int}(\mathbf{x}[0]), \operatorname{float}(\mathbf{x}[1])]
                                               flist [x[0]+base\_count]=x[1]
33
                                      if idx in f_map:
                                               f_map[idx].update(flist)
                                      else:
                                               f_{-}map[idx] = flist
            return f_map,base_count+feature_count
    def AppendFromDirUI(path,base_count):
            f_map={}
            feature\_count=0
            for file in os. listdir (path):
                     header=True
                     base_count+=feature_count
                     for line in open(path+file):
                              if header:
                                      feature_count=int(line)
                                      header=False
                              else:
                                      line = line. split ('\t')
                                      idx = (int(line [0]), int(line [1]))
                                       flist = \{\}
53
                                      for f in line [2:]:
                                               if f.rstrip().lstrip()=="":continue
                                               x = f. split (':')
                                               \mathbf{x} = [\operatorname{int}(\mathbf{x}[0]), \operatorname{float}(\mathbf{x}[1])]
                                               flist [x[0]+base\_count]=x[1]
                                      if idx in f_map:
                                               f_map[idx].update(flist)
```

18

28

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43

48

58

```
f_{map}[idx] = flist
                           return f_map,base_count+feature_count
          global_f = 0
           user_f = 0
          item_f = 0
          #Global Feature
          Global_Feature_u, global_f=AppendFromDir('GlobalFeature/u/',0)
          Global_Feature_i, global_f = AppendFromDir('GlobalFeature/i/',global_f)
          Global_Feature_ui, global_f = AppendFromDirUI('GlobalFeature/ui/',global_f)
         print 'Global_Feature_Count:%d'%global_f
          #User Feature
          User_Feature, user_f = AppendFromDir('UserFeature/', user_count)
          print 'User_Feature_Count:%d'%user_f
          #Item Feature
         Item_Feature,item_f=AppendFromDir('ItemFeature/',item_count)
          print 'Item_Feature_Count:%d'%item_f
           global_f_c = 0
           user_f_c = 1
          item\_f\_c\!=\!1
            global_f_list =[]
           user_f_list = []
           item_f_list = []
           global_f_v = []
           user_f_v = []
          \text{item}_{f_v} = []
          ftrain = open('Result/'+sys.argv[1]+'/global.train.txt', 'w')
          for line in open('Data/training_data.txt'):
                           line = map(int, map(float, line. split('\t')))
                           u, i, r = line
                           #generate global feature
                            global f_c = len(Global Feature u.get(u, \{\})) + len(Global Feature i.get(i, \{\})) + len(Global Feature u.get((u, i), \{\}))
 98
                            global\_feature\_i.get(i,\{\}).keys() + Global\_Feature\_i.get(i,\{\}).keys() + Global\_Feature\_i.get((u,i),\{\}).keys() + Global\_Featu
                            global\_feature\_i.get(i, \{\}).values() + Global\_feature\_i.get(i, \{\}).values() + Global\_feature\_ui.get((u, i), \{\}).
                                     values()
                           #generate user feature
                            user_f_c = 1 + len(User_Feature.get(u, {}))
                            user_f_list = [u] + User_f_eature.get(u, {}).keys()
103
                            user_f_v = [1] + User_Feature.get(u, {}).values()
                            #generate item feature
                           item_f_c=1+len(Item_Feature.get(i,{}))
                            item_f_list = [i] + Item_Feature.get(i, {}).keys()
                           item_f_v=[1]+Item_Feature.get(i,{}).values()
108
                           ftrain.write('\%d_\%d_\%d_\%d_\%(r,global_f_c,user_f_c,item_f_c))
                           for j in range(global_f_c):
                                            ftrain.write('\%d:\%.8f_-'\%(global\_f_-list[j],global\_f_-v[j]))
                           for j in range(user_f_c):
113
                                            ftrain.write('\%d:\%.8f_-'\%(user_f_list[j], user_f_v[j]))
                           for j in range(item_f_c):
                                            ftrain .write('%d:%.8f_'%(item_f_list[j], item_f_v[j]))
                           ftrain.write('\n')
118
          ftrain.close()
          print 'Generate_Training_Over.'
123
           ftest = open('Result/'+sys.argv[1]+'/global.test.txt', 'w')
          for line in open('Data/testing_data.txt'):
                           line = map(int, map(float, line. split('\t')))
```

else:

```
u,i,r=line
             #generate global feature
128
             global f_c = len(Global feature\_u.get(u, \{\})) + len(Global feature\_i.get(i, \{\})) + len(Global feature\_u.get((u, i), \{\}))
              global\_f-list = Global\_Feature\_u.get(u, \{ \} ).keys() + Global\_Feature\_i.get(i, \{ \} ).keys() + Global\_Feature\_ui.get((u,i), \{ \} ).
             global\_feature\_i.get(i, \{\}).values() + Global\_feature\_i.get(i, \{\}).values() + Global\_feature\_ui.get((u, i), \{\}).
                  values()
             #generate user feature
             user_f_c = 1 + len(User_Feature.get(u, {}))
133
              user_f_list = [u] + User_F_eature.get(u, {}).keys()
             user_f_v = [1] + User_Feature.get(u, {}).values()
             #generate item feature
             item_f_c=1+len(Item_Feature.get(i,{}))
             item_f_list = [i] + Item_F_eature.get(i, {}).keys()
138
             item_f_v=[1]+Item_Feature.get(i,{}).values()
             ftest .write('%d_%d_%d_%d_'%(r,global_f_c,user_f_c,item_f_c))
             for j in range(global_f_c):
                      ftest .write('%d:%.8f_'%(global_f_list[j], global_f_v[j]))
143
             for j in range(user_f_c):
                      ftest .write('%d:%.8f_'%(user_f_list[j], user_f_v[j]))
             for j in range(item_f_c):
                      ftest .write('%d:%.8f_'%(item_f_list[j], item_f_v[j]))
148
             ftest .write('\n')
     ftest . close ()
     print 'Generate_Testing_Over.'
153
     os.mkdir('Result/'+sys.argv[1]+'/model')
     #Generate Run.bat
     bat = open('Result/'+sys.argv[1]+'/run.bat','w')
    bat.write(r
     "../../ Lab/make_feature_buffer.exe" global.train.txt global.train.buffer
     "../../ Lab/make_feature_buffer.exe" global.test.txt global.test.buffer
     "../../ Lab/svdfeature.exe" basicMF.conf num_round=%d
163
     " %(num_round))
     bat.write(' "../../ Lab/svdfeature_infer.exe"_basicMF.conf\n')
168
    bat.write('pause')
     bat.close()
     print '---------Make_svdFeature_Feature------'
  • BiasMF.cpp
     Bias FM of C++ version using opency matrix lib.
     #include <iostream>
     #include <iomanip>
    #include <fstream>
     #include <sstream>
     #include <vector>
     #include <time.h>
     #include <opencv2\opencv.hpp>
     using namespace std;
     using namespace cv;
     typedef struct _TData
13
     {
             int x;
             int y;
             double r;
```

```
}TData;
   int f=1;
   int dims=2;
   int size [={55965,14334};/{51296,12742};
   int usize []=\{ size [0], f\};
   int isize []=\{size [1], f\};
   int mu\_usize[] = {size [0]};
   int mu_{isize}[] = {size [1]};
   vector<TData> RattingData;
   vector<TData> TestData;
   Mat U(dims, usize, CV_64F);
   Mat I(dims, isize, CV_64F);
   Mat U_mu(1,mu_usize,CV_64F);
   Mat I_{mu}(1, mu_{isize}, CV_{64F});
   Mat U_c(1,mu\_usize,CV\_32S);
   Mat I_c(1, mu\_isize, CV\_32S);
   double eta=0.0008;
   double lambda=0.5;
   int MaxIter=200;
   double mu=0.0;
   void ImportData()
   {
           ifstream trainfile ("training_data.txt");
           TData t;
43
           while (! trainfile .eof())
                    trainfile >> t.x >> t.y >> t.r;
                   RattingData.push\_back(t);
                   mu+=t.r;
48
            trainfile . close();
           cout << "Training_Data_Size:_" << RattingData.size() << endl;
           mu/=RattingData.size();
53
           ifstream testfile ("testing_data.txt");
           while (! testfile .eof())
                    testfile >>t.x>>t.y>>t.r;
                   TestData.push\_back(t);
            testfile . close();
           cout << "Test_Data_Size:_" << TestData.size() << endl;
63
           cout << ``Global\_Mean:\_" << mu << ``\_Lambda:\_" << lambda << ``\_Eta:\_" << eta << endl;
   }
   void WritePredictFile()
   {
68
           ofstream f("predict");
           double rmse=0.0;
           for (vector < TData>::iterator iter=TestData.begin();iter!=TestData.end();iter++)
                   73
                        row(iter->y).t())).at<double>(0,0);
                   if (r_predict < 1) r_predict = 1;</pre>
                   if (r_predict > 5) r_predict = 5;
                   f{<<}r\_predict{<<}endl;
                   double error=r_predict-iter->r;
                   rmse+=error*error;
78
           rmse=sqrt(rmse/TestData.size());
           f.close();
           cout<<"Predict_File_Generate_Over._Final_rmse:_"<<rmse<<endl;
   }
```

```
double CalcTestRmse()
                          double rmse=0.0;
                          for (vector < TData>::iterator iter=TestData.begin();iter!=TestData.end();iter++)
 88
                                          double r_predict=mu+U_mu.at<double>(iter->x)+I_mu.at<double>(iter->y)+((Mat)(U.row(iter->x)*I.
                                                     row(iter->y).t()).at<double>(0,0);
                                           if (r_predict < 1) r_predict = 1;</pre>
                                           if (r_predict > 5) r_predict = 5;
                                           double error=r_predict-iter->r;
 93
                                          rmse+=error*error;
                          }
                          rmse=sqrt(rmse/TestData.size());
                          return rmse;
          }
          float BasicMF()
                          ofstream rmse_file ("rmse.txt");
103
                          double rmse=0.0;
                          double pre_rmse=100.0;
                          randu(U,Scalar(0),Scalar(1/sqrt((double)f)));
                          randu(I,Scalar(0),Scalar(1/sqrt((double)f)));
108
                          randu(U_mu,Scalar(0),Scalar(0));
                          randu(I_mu,Scalar(0),Scalar(0));
                          for (int t=0;t<MaxIter;t++)
113
                                           clock_t start=clock();
                                           for (vector < TData>::iterator iter=RattingData.begin();iter!=RattingData.end();iter++)
                                                           double u_mu=U_mu.at<double>(iter->x);
                                                           double i_mu=I_mu.at<double>(iter->y);
                                                           double r_predict=mu+u_mu+i_mu+((Mat)(U.row(iter->x)*I.row(iter->y).t())).at<double>(0,0);
                                                           double error=r_predict-iter->r;
                                                            for (int k=0; k< f; k++)
123
                                                                            double u=U.at < double > (iter->x,k);
                                                                           double i=I.at<double>(iter->y,k);
                                                                            U.at < double > (iter -> x, k) = u - eta*(error*i + lambda*u);
                                                                            I.at < double > (iter -> y, k) = i - eta*(error*u + lambda*i);
128
                                                           U_mu.at<double>(iter->x)=u_mu-eta*(error+lambda*u_mu);
                                                           I_mu.at<double>(iter->y)=i_mu-eta*(error+lambda*i_mu);
                                                           rmse+=error*error;
                                           }
133
                                          rmse=sqrt(rmse/RattingData.size());
                                           clock_t end=clock();
                                          double rmse_test=CalcTestRmse();
                                          cout << "Iter:\_" << std::setw(3) << t << "\tRMSE:\_" << rmse << "\tTest\_RMSE:\_" << rmse_test << "\tTime:\_" << rmse_test << "\tTime:\_" << rmse_test << "\tTime:_" << rmse_test << \tTime:_" << rmse_test << \tTime:_" << rmse_test << \tTime:_" << rmse_test << \tTime:_" << rmse_test << rmse_test << \tTime:_" << rmse_test << \tTime:_" << rmse_test << rmse_test << \tTime:_" << rmse_test << \tTime:_" << rmse_test << rmse_test << \tTime:_" << rmse
                                                     <<((double)end-start)/CLOCKS_PER_SEC <<"s"<<endl;
138
                                           rmse\_file << rmse << "\t" << rmse\_test << endl;
                          rmse_file . close();
                          return 0;
         }
143
          void WriteMatToFile(char * filename,Mat &m)
          {
                          ofstream of(filename);
                          for (int i=0; i< m.cols; i++)
148
```

```
for (int j=0; j< m.rows; j++)
                                 of << m.at < double > (i,j) << " \t";
   153
                         of < < endl;
                 of.close();
        }
   158
        void WriteFeatureToFile(char * filename,Mat &A,Mat &B)
                 ofstream of(filename);
                 for (int i=0; i<A.cols; i++)
   163
                         int j=0;
                         for(j=0;j<A.rows;j++)
                                 of << A.at < double > (j,i) << "\t";
   168
                         for(j=0;j<B.rows;j++)
                                 of << B.at < double > (j,i) << " \t";
                         of < < endl;
   173
                 of.close();
        }
        int main(int argc,char * argv [])
                 if(argc>1)
                         istringstream para(argv[1]);
                         para>>f;
   183
                 ImportData();
                 BasicMF();
   188
                 WriteFeatureToFile("v",U,I);
                 WriteFeatureToFile("w",U_mu,I_mu);
                 WritePredictFile();
   193
                 getchar();
                 return 0;
3. Lei
      ullet make Feature Vector. py
        this script is created for make feature vectors based on the generated feature files.
        # -*- coding: utf-8 -*-
        Created on Thu Jul 25 23:52:09 2013
        this script is created for make feature vectors based on the generated feature files
        import os
        import sys
        def readUidIidRating(strInputFile):
             listUid = list()
             listIid = list()
            listRating = list()
    14
```

for line in file (strInputFile):

```
line = line. rstrip()
            strArr = line. split ('\t')
            listUid.append(strArr[0])
             listIid .append(strArr[1])
19
             if len(strArr) == 3:
                listRating.append(strArr[2])
            else:
                listRating.append(4)
        return (listUid, listIid, listRating)
24
    def readGlobalFeatures(strFeatureFile):
        dictID2Feature = dict()
        indexOffset = 0
        for line in file (strFeatureFile):
29
            line = line. rstrip()
            strArr = line. split ('\t')
            if len(strArr) == 1:
                indexOffset = int(strArr[0])
34
                dictID2Feature[strArr[0]+"_"+strArr[1]] = list()
                for i in xrange(2,len(strArr)):
                     if strArr[i] != "":
                         dictID2Feature[strArr[0]+"_"+strArr[1]].append(strArr[i])
        return (dictID2Feature,indexOffset)
    def readFeatures(strFeatureFile):
        dictID2Feature = dict()
        indexOffset = 0
        for line in file (strFeatureFile):
            line = line. rstrip()
            strArr = line. split ('\t')
            if len(strArr) == 1:
                indexOffset = int(strArr[0])
            else:
49
                dictID2Feature[strArr [0]] = list()
                for i in xrange(1,len(strArr)):
                     if strArr[i] != "":
                         dictID2Feature[strArr [0]]. append(strArr[i])
        return (dictID2Feature,indexOffset)
54
    def initFeatureVector(listRating):
        listVector = list()
        for i in xrange(len(listRating)):
             listVector .append("")
59
        return listVector
    def initFeatureVectorLen(listRating):
        listVector = list()
        for i in xrange(len(listRating)):
            listVector.append(0)
        return listVector
    def appendGlobalFeatureS(strFeatureFile,listFeatureVectors,listFeatureVectorsLen, listEntity, currentIndex):
        dictID2Feature, indexOffset = readGlobalFeatures(strFeatureFile)
        print strFeatureFile
        for i in xrange(0,len(listEntity)):
             if dictID2Feature.has_key(listEntity[i]):
                 features = dictID2Feature[listEntity[i]]
74
                for j in xrange(0,len(features)):
                    strArr = features[j]. split(':')
                     listFeatureVectors\left[\,i\,\right] \;+=\;"\backslash t"\;+\;str(currentIndex+int(strArr[0]))+":"+strArr[1]
                    listFeatureVectorsLen[i] += 1
        currentIndex += indexOffset
        return (listFeatureVectors, listFeatureVectorsLen, currentIndex)
    def appendFeatureS(strFeatureFile,listFeatureVectors,listFeatureVectorsLen, listEntity,currentIndex):
        dictID2Feature,indexOffset = readFeatures(strFeatureFile)
```

```
print strFeatureFile
84
         for i in xrange(0,len(listEntity)):
             if dictID2Feature.has_key(listEntity[i]):
                 features = dictID2Feature[listEntity[i]]
                 for j in xrange(0,len(features)):
                    strArr = features[j]. split(':')
 89
                     listFeatureVectors [i] += "\t" + str(currentIndex+int(strArr[0]))+":"+strArr[1]
                    listFeatureVectorsLen[i] += 1
         currentIndex += indexOffset
         return (listFeatureVectors, listFeatureVectorsLen, currentIndex)
94
    def combineUidIid(listUid, listIid ):
         listUidIid = list()
         for i in xrange(len(listUid)):
             listUidIid .append(listUid[i]+"-"+listIid[i])
         return listUidIid
    def max(int_1,int_2):
         if int_1 > int_2:
             return int_1
         else:
104
             return int_2
     if '__main__' == __name__:
         ## input
        strTrainUidIidRating = sys.argv[1]
109
        strTestUidIidRating = sys.argv[2]
         strConfigFileTemplate = r"D:\Experiment\configTemplate.conf"
         strItemFeatureFileDir = r"D:\Experiment\FeatureS\i"
         strUserFeatureFileDir = r"D:\Experiment\Features\u"
         strGlobalFeatureFileDir = r"D:\Experiment\Features\g"
114
         ## output
         strTrainFeatureFile = sys.argv[3]
         strTestFeatureFile = sys.argv[4]
         strConfigFile = sys.argv[5]
119
         userFeatureCnt = 0
         itemFeatureCnt = 0
         globalFeatureCnt = 0
         listTrainUid, listTrainIid, listTrainRating = readUidIidRating(strTrainUidIidRating)
124
         listTestUid, listTestIid, listTestRating = readUidIidRating(strTestUidIidRating)
         listTrainUidIid = combineUidIid(listTrainUid,listTrainIid)
         listTestUidIid = combineUidIid(listTestUid, listTestIid)
         listTrainFeatureVectors = initFeatureVector(listTrainRating)
129
         listTestFeatureVectors = initFeatureVector(listTestRating)
         listTrainGlobalFeatureVectorLen = initFeatureVectorLen(listTrainRating)
         listTestGlobalFeatureVectorLen = initFeatureVectorLen(listTestRating)
         listTrainUserFeatureVectorLen = initFeatureVectorLen(listTrainRating)
         listTestUserFeatureVectorLen = initFeatureVectorLen(listTestRating)
134
         listTrainItemFeatureVectorLen = initFeatureVectorLen(listTrainRating)
         listTestItemFeatureVectorLen = initFeatureVectorLen(listTestRating)
         currentFeatureIndex = 0
         trainCurrentFeatureIndex = 0
139
         testCurrentFeatureIndex = 0
    ## get avg rating
         avgRating = 0
144
         for i in xrange(len(listTrainRating)):
             avgRating += float(listTrainRating[i])
         avgRating = float(avgRating)/len(listTrainRating)
     ## global feature
         featureFileList = os. listdir (strGlobalFeatureFileDir)
149
         for i in xrange(0,len(featureFileList)):
             featureFilePath = os.path.join(strGlobalFeatureFileDir, featureFileList [i])
```

```
list Train Feature Vectors \ , list Train Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Vector Len, train Current Feature Index = append Global Feature Ind
                                        feature File Path, list Train Feature Vectors, list Train Global Feature Vector Len, list Train Uid Iid, train Current Feature Index)
                             listTestFeatureVectors, listTestGlobalFeatureVectorLen, testCurrentFeatureIndex = appendGlobalFeatureS(
                                        featureFilePath,listTestFeatureVectors,listTestGlobalFeatureVectorLen,listTestUidIid,testCurrentFeatureIndex)
                    globalFeatureCnt = max(trainCurrentFeatureIndex, testCurrentFeatureIndex)
154
           ##user feature
           ##user id feature
                    currentFeatureIndex = 0
           ##training set
                    dicUid2Idx = dict()
159
                    for i in xrange(0,len(listTrainUid)):
                             listTrainUserFeatureVectorLen[i] += 1
                              if dicUid2Idx.has_key(listTrainUid[i]):
                                       list Train Feature Vectors [i] \ += \ "\ t" + str(dic Uid 2 Idx[list Train Uid [i]]) + ":1"
                             else:
164
                                      dicUid2Idx[listTrainUid[i]] = currentFeatureIndex
                                      currentFeatureIndex += 1
                                      listTrainFeatureVectors[i] += "\t" + str(dicUid2Idx[listTrainUid[i]]) +":1"
           ##testing set
                    for i in xrange(0,len(listTestUid)):
169
                             listTestUserFeatureVectorLen[i] += 1
                              if dicUid2Idx.has_key(listTestUid[i]):
                                       listTestFeatureVectors [i] += "\t" + str(dicUid2Idx[listTestUid[i]]) + ":1"
                             else:
                                      dicUid2Idx[listTestUid[i]] = currentFeatureIndex
174
                                      currentFeatureIndex += 1
                                      listTestFeatureVectors [i] += "\t" + str(dicUid2Idx[listTestUid[i]]) + ":1"
                    print currentFeatureIndex
           ##user features exclude user id
                    trainCurrentFeatureIndex = currentFeatureIndex
179
                    testCurrentFeatureIndex = currentFeatureIndex
                     featureFileList = os. listdir (strUserFeatureFileDir)
                    for i in xrange(len(featureFileList)):
                             featureFilePath = os.path.join(strUserFeatureFileDir, featureFileList [i])
                             list Train Feature Vectors, list Train User Feature Vector Len, train Current Feature Index = append Feature S(feature File Path, train Current Feature Index). \\
184
                                        listTrainFeatureVectors, listTrainUserFeatureVectorLen, listTrainUid, trainCurrentFeatureIndex)
                             list Test Feature Vectors, list Test User Feature Vector Len, test Current Feature Index = append Feature S(feature File Path, test Current Feature Index). The state of the
                                        listTestFeatureVectors, listTestUserFeatureVectorLen, listTestUid, testCurrentFeatureIndex)\\
                    userFeatureCnt = max(trainCurrentFeatureIndex, testCurrentFeatureIndex)
           ##item feature
           ##item id feature
                    currentFeatureIndex = 0
           ##training set
                    dicIid2Idx = dict()
                    for i in xrange(0,len( listTrainIid )):
                             listTrainItemFeatureVectorLen[i] += 1
194
                              if dicIid2Idx.has_key(listTrainIid[i]):
                                      listTrainFeatureVectors[i] += "\t"+str(dicIid2Idx[listTrainIid[i]]) +":1"
                                      dicIid2Idx [ listTrainIid [ i ]] = currentFeatureIndex
                                      currentFeatureIndex += 1
199
                                      listTrainFeatureVectors [i] \ += \ "\ t" + str(dicIid2Idx[listTrainIid[i]]) + ":1"
           ##testing set
                    for i in xrange(0,len( listTestIid )):
                             listTestItemFeatureVectorLen[i] += 1
                              if dicIid2Idx.has_key(listTestIid[i]):
204
                                       listTestFeatureVectors[i] += "\t"+str(dicIid2Idx[listTestIid[i]]) +":1"
                             else:
                                      \label{eq:dicIid2Idx[iistTestIid[ii]]} \ = \ currentFeatureIndex
                                      currentFeatureIndex += 1
                                      listTestFeatureVectors[i] += "\t"+str(dicIid2Idx[listTestIid[i]]) +":1"
209
           ##item features exclude item id
                    trainCurrentFeatureIndex = currentFeatureIndex
                    testCurrentFeatureIndex = currentFeatureIndex
                     featureFileList = os. listdir (strItemFeatureFileDir)
214
                    for i in xrange(len(featureFileList)):
```

```
list Train Feature Vectors, list Train Item Feature Vector Len, train Current Feature Index = append Feature S(feature File Path, train Current Feature Index). The state of the state of
                                                                               listTrainFeatureVectors, listTrainItemFeatureVectorLen, listTrainIid, trainCurrentFeatureIndex)
                                                          list Test Feature Vectors, list Test Item Feature Vector Len, test Current Feature Index = append Feature S(feature File Path, test Current Feature Index). The state of the
                                                                               listTestFeatureVectors, listTestItemFeatureVectorLen, listTestIid, testCurrentFeatureIndex)
219
                                       itemFeatureCnt = max(trainCurrentFeatureIndex, testCurrentFeatureIndex)
                     ##merge rating, feature count, features
                                       for i in xrange(len(listTrainFeatureVectors)):
                                                         list Train Feature Vectors \ [i\ ] = list Train Rating \ [i\ ] + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) + "\ t" + str(list Train Global Feature Vector Len \ [i\ ]) +
                                                                              list Train User Feature Vector Len[i]) + "\t" + str(list Train Item Feature Vector Len[i]) + list Train Feature Vectors[i]
                                       for i in xrange(len(listTestFeatureVectors)):
224
                                                          listTestFeatureVectors [i] = listTestRating [i] + "\t" + str(listTestGlobalFeatureVectorLen [i]) + "\t" + str(listTestGlobalFeatureVe
                                                                              listTestUserFeatureVectorLen[i]) + "\t" + str(listTestItemFeatureVectorLen[i]) + listTestFeatureVectors[i] + [listTestItemFeatureVectorLen[i]] + [listTestItemVectorLen[i]] + [listTestItemVectorLen[i]] + [listTestItemVectorVectorLen[i]] + [listTestItemVectorVectorLen[i]] + [listTestItemVectorVectorVectorVectorVector
                     ##restore
                                          f_train = open(strTrainFeatureFile,"w")
229
                                        for i in xrange(0,len(listTrainFeatureVectors)):
                                                           f_train . write(listTrainFeatureVectors[i]+"\n")
                                         f_train . close ()
                                          f_test = open(strTestFeatureFile,"w")
                                        for i in xrange(0,len(listTestFeatureVectors)):
                                                           f_test .write(listTestFeatureVectors[i]+"\n")
                                          f_test . close ()
                     ##generate config file
                     print "globalFeatureCnt_=_%d,_userFeatureCnt_=_%d,_itemFeatureCnt_=_%d" %(globalFeatureCnt,userFeatureCnt,
                                           itemFeatureCnt)
                     intLineIdx = 1
                     f = open(strConfigFile,"w")
                     for line in file (strConfigFileTemplate):
                                        if intLineIdx == 4:
244
                                                         f.write("base\_score\_=\_"+str(avgRating)+" \setminus n")
                                          elif intLineIdx == 16:
                                                          f.write("num_item___=_"+str(itemFeatureCnt)+"\n")
                                          elif intLineIdx == 17:
                                                         f.write("num\_user\_\_\_"+str(userFeatureCnt)+" \setminus n")
249
                                          elif intLineIdx == 19:
                                                          f.write("num\_global\_=\_"+str(globalFeatureCnt)+"\setminus n")
                                                          f.write(line)
                                       intLineIdx += 1
                     f.close()

    svdPP.bat

                     this script is used to run the svd++ model.
                     svdpp_randorder training_set_re.txt train_set_re.svdpporder
                      line_reorder training_set_re.txt train_set_re.svdpporder train_set_re.shuffle
                     python mkbasicfeature.py train_set_re.shuffle training_set.basicfeature
                    python mkimplicitfeedbackfeature.py ALLRecord.txt train_set_re.shuffle train_set_feedback
                     make_ugroup_buffer training_set.basicfeature training_set.buffer -fd train_set.feedback
                     python group_predict.py predict_re.txt predict_re.g.txt
                    python mkbasicfeature.py predict_re.g.txt testing_set .basicfeature
                     python mkimplicitfeedbackfeature.py AllRecord.txt predict_re.g.txt test_set .feedback
                     make_ugroup_buffer testing_set.basicfeature testing_set.buffer -fd test_set.feedback
                     svdfeature implicitFeedback.conf num_round=87
                     svdfeature_infer implicitFeedback.conf pred=87
                     reidx.py pred.txt pred_final.txt
                     pause
           • makeCatBiasFeature.py
```

script used to generate global features from business categories.

featureFilePath = os.path.join(strItemFeatureFileDir, featureFileList [i])

```
def getEntity2IdMap(strMapFile):
       dicEntity2ID = dict()
       for line in file (strMapFile):
            line = line.rstrip()
           strArr = line. split('\t')
           dicEntity2ID[strArr [0]] = strArr[1]
       return dicEntity2ID
   def getItem2Feature(strTrainBusi,strTestBusi,item2ID):
       catID = 0
13
       dicCat2ID = dict()
       dicBusi2Feature = dict()
       for line in file (strTrainBusi):
            line = line. rstrip()
            js = json.loads(line)
18
           busi = js["business_id"]
           cats = js["categories"]
           feature = ""
            for cat in cats:
                if not dicCat2ID.has_key(cat):
                   dicCat2ID[cat] = catID
                   catID += 1
               feature += "\t"+str(dicCat2ID[cat])+":1"
           dicBusi2Feature[item2ID[busi]] = feature
       return (dicBusi2Feature,catID)
   strIid2IDmap = r"D:\Experiment\rawData\itemmap.final"
   strUser2IDmap = r"D:\Experiment\rawData\usermap.final"
   strTrainBusi = r"D:\Experiment\rawData\yelp_training_set\training_set_business.json"
   strTestBusi = r"D:\Experiment\rowData\yelp\_test\_set\test\_set\_business.json"
   strTrainReview = r"D:\Experiment\rawData\yelp_training_set\training_set_review.json"
   strTestReview = r"D:\Experiment\rawData\yelp\_test\_set\test\_set\_review.json"
   strBiasCatFeature = r"biasCatFeature.txt"
   user2ID = getEntity2IdMap(strUser2IDmap)
   item2ID = getEntity2IdMap(strIid2IDmap)
   dicBusi2Feature, featureCnt = getItem2Feature(strTrainBusi, strTestBusi, item2ID)
   f = open(strBiasCatFeature,"w")
   f.write(str(featureCnt)+"\n")
   for line in file (strTrainReview):
        line = line.rstrip()
       js = json.loads(line)
       user = js["user\_id"]
       busi = js["business_id"]
        if dicBusi2Feature.has_key(item2ID[busi]):
           f.write(user2ID[user]+"\t"+item2ID[busi]+dicBusi2Feature[item2ID[busi]]+"\n")
   for line in file (strTestReview):
        line = line.rstrip()
        js = json.loads(line)
58
       user = js["user\_id"]
       busi = js["business\_id"]
        if dicBusi2Feature.has_key(item2ID[busi]):
           f.write(user2ID[user]+"\t"+item2ID[busi]+dicBusi2Feature[item2ID[busi]]+"\n")
   f.close()
   make Item Name Feature.py
   extract the headword of item names as item feature.
   import json
```

import json

```
def getHeadWord(str):
        strArr = str. split (' _')
        listWord = list()
        listWord.append(strArr[-1])
        return listWord
   def getEntity2IdMap(strMapFile):
        dicEntity2ID = dict()
        for line in file (strMapFile):
            line = line.rstrip()
            strArr = line. split('\t')
            dicEntity2ID[strArr [0]] = strArr[1]
15
        return dicEntity2ID
    dicItem2HeadWord = dict()
   strTrainBusinessPath = r"D:\Experiment\rawData\yelp_training_set\training_set_business.json"
    strTestBusinessPath = r"D:\Experiment\rawData\yelp_test_set\test_set_business.json"
    strIid2IDmap = r"D:\Experiment\rawData\itemmap.final"
    strCatFeature = r"iiWordIdfFeature.txt"
   dicItem2ID = getEntity2IdMap(strIid2IDmap)
    dicWord2ID = dict()
    wordID = 0
    dicItem2WordList = dict()
   dicWord2ItemList = dict()
    intItemCnt = 0
    for line in file (strTrainBusinessPath):
        intItemCnt += 1
        line = line.rstrip()
35
        js = json.loads(line)
        bid = js["business\_id"]
        busiName = js["name"]
        words = getHeadWord(busiName)
        dicItem2WordList[bid] = list()
40
        for word in words:
            dicItem2WordList[bid].append(word)
            if not dicWord2ItemList.has_key(word):
                dicWord2ItemList[word] = list()
            dicWord2ItemList[word].append(bid)
45
    for line in file (strTestBusinessPath):
       intItemCnt += 1
        \mathrm{line} \, = \mathrm{line.}\,\mathrm{rstrip}\,()
        js = json.loads(line)
        bid = js["business\_id"]
        busiName = js["name"]
        words = getHeadWord(busiName)
        dicItem2WordList[bid] = list()
        for word in words:
55
            dicItem2WordList[bid].append(word)
            if not dicWord2ItemList.has_key(word):
                dicWord2ItemList[word] = list()
            dicWord2ItemList[word].append(bid)
60
    f = open(strCatFeature,"w")
    f.write(str(intItemCnt)+"\n")
    for line in file (strTrainBusinessPath):
        line = line. rstrip()
        js = json.loads(line)
65
        bid = js["business_id"]
        hsNBid = set()
        for word in dicItem2WordList[bid]:
            for Nbid in dicWord2ItemList[word]:
```

```
if Nbid!= bid:
    70
                        hsNBid.add(Nbid)
            if len(hsNBid) == 0:
                continue
            f.write(dicItem2ID[bid])
            for NBid in hsNBid:
    75
                f.write("\t"+dicItem2ID[NBid]+":1")
            f.write("\n")
        for line in file (strTestBusinessPath):
            line = line. rstrip()
            js = json.loads(line)
    80
            bid = is["business\_id"]
            hsNBid = set()
            for word in dicItem2WordList[bid]:
                for Nbid in dicWord2ItemList[word]:
                    if Nbid!= bid:
                        hsNBid.add(Nbid)
            if len(hsNBid) == 0:
                continue
            f.write(dicItem2ID[bid])
            for NBid in hsNBid:
                f.write("\t"+dicItem2ID[NBid]+":1")
            f.write("\n")
        f.close()
4. Xudong
     • Dataset2.cs
        for loading data.
        using System;
        using System. Collections. Generic;
        using System.Linq;
       using System. Text;
        using System.IO;
        using Newtonsoft.Json;
        using yelpRS.dataset.details;
        namespace yelpRS.dataset
            public class DataSet2
                double globelave = 3.7667;
    14
                public Dictionary<string, int> uidindex = new Dictionary<string, int>();
                public Dictionary<string, int> bidindex = new Dictionary<string, int>();
                public Dictionary<string, userinfo> userlist = new Dictionary<string, userinfo>();
                public Dictionary < string, businessinfo > businesslist = new Dictionary < string, businessinfo > ();
                public Dictionary < string, datainfo > traindatalist = new Dictionary < string, datainfo > ();
                public List<datainfo> testdatalist = new List<datainfo>();
                public List<datainfo> testdatalist1 = new List<datainfo>();
                public List<datainfo> testdatalist2 = new List<datainfo>();
    24
                public List<datainfo> testdatalist3 = new List<datainfo>();
                public List<datainfo> testdatalist4 = new List<datainfo>();
                public Dictionary<string, int> userwordcount = new Dictionary<string, int>();
    29
                public Dictionary<string, int> businesswordcount = new Dictionary<string, int>();
                public Dictionary<string, int> tagidindex = new Dictionary<string, int>();
                public Dictionary<string, int> positionidindex = new Dictionary<string, int>();
                public Dictionary<string, List<int>> userreviewlist = new Dictionary<string, List<int>>>();
                public Dictionary<string, List<int>> itemreviewlist = new Dictionary<string, List<int>>>();
    34
                public Dictionary<string, double> userave = new Dictionary<string, double>();
                public Dictionary<string, double> itemave = new Dictionary<string, double>();
                public Dictionary<string, double> userva = new Dictionary<string, double>();
```

public Dictionary<string, double> itemva = new Dictionary<string, double>();

```
public Dictionary<string, int> usercount = new Dictionary<string, int>();
39
             public Dictionary<string, int> itemcount = new Dictionary<string, int>();
             public Dictionary<string, int> businessnameindex = new Dictionary<string, int>();
             public Dictionary < string, int > businessname index 2 = new Dictionary < string, int > ();
             public Dictionary < string, int > streetindex = new Dictionary < string, int > ();
             public Dictionary < string, List < double >> usertopic = new Dictionary < string, List < double >> ();
44
             public Dictionary<string, List<double>> businesstopic = new Dictionary<string, List<double>>();
             public Dictionary < string, List < double >> userreview topic = new Dictionary < string, List < double >> ();
             public Dictionary<string, List<double>> businessreviewtopic = new Dictionary<string, List<double>>();
             //checkin
49
             public Dictionary<string, Dictionary<int, int>> traincheckinlist = new Dictionary<string, Dictionary<int, int>>();
             public Dictionary<string, Dictionary<int, int>> testcheckinlist = new Dictionary<string, Dictionary<int, int>>();
             public Dictionary<string, Dictionary<int, int>> checkinhourlist = new Dictionary<string, Dictionary<int, int>>();
             public Dictionary<string, Dictionary<int, int>> checkindaylist = new Dictionary<string, Dictionary<int, int>>();
             public Dictionary < string, int > traincheckincount = new Dictionary < string, int > ();
             public Dictionary < string, int > testcheckincount = new Dictionary < string, int > ();
             Dictionary<int, string> map = new Dictionary<int, string>();
             Dictionary<int, string> umap = new Dictionary<int, string>();
             Dictionary\langle \text{string} \rangle \text{ map2} = \text{new Dictionary} \langle \text{string} \rangle ();
             Dictionary<string, string> usermap2 = new Dictionary<string, string>();
             public Dictionary<string, int> jblantdic = new Dictionary<string, int>();
             public Dictionary<string, int> jblongdic = new Dictionary<string, int>();
64
             public Dictionary < string, int > jblocationdic = new Dictionary < string, int > ();
             public Dictionary<string, int> jbstreetdic = new Dictionary<string, int>();
             public Dictionary<string, int> jbzipcodedic = new Dictionary<string, int>();
             public Dictionary < string, int > jbusertimebindic = new Dictionary < string, int > ();
             public Dictionary < string, int > jbitemtimebindic = new Dictionary < string, int > ();
 69
             public Dictionary < string, int > jbitemopencity = new Dictionary < string, int > ();
             public Dictionary<string, int> jbcattypedic = new Dictionary<string, int>();
             public Dictionary<string, List<int>> jbica = new Dictionary<string, List<int>>>();
             public Dictionary<string, int> jbitemcity = new Dictionary<string, int>();
             public Dictionary<string, int> jbitemstate = new Dictionary<string, int>();
             public Dictionary<string, int> jbitemreview = new Dictionary<string, int>();
             public Dictionary<string, int> jbusergender = new Dictionary<string, int>();
             public Dictionary<string, int> jbuserreview = new Dictionary<string, int>();
             public Dictionary < string, int > jbusernamelen = new Dictionary < string, int > ();
             public Dictionary<string, int> jbqch = new Dictionary<string, int>();
 79
             public Dictionary<string, int> jbqbn = new Dictionary<string, int>();
             public Dictionary<string, List<double>> useremotionwords = new Dictionary<string, List<double>>();
             public Dictionary<string, List<double>> itememotionwords = new Dictionary<string, List<double>>();
 84
             public Dictionary < string, int > streetname index = new Dictionary < string, int > ();
 89
             void loadMap(string path)
                 StreamReader sr = new StreamReader(path + "itemmap.final");
                 string line = "";
 94
                 while ((line = sr.ReadLine()) != null)
                     string [] s = line. Split('\t');
                     \operatorname{map.Add}(\operatorname{int.Parse}(s[1]), s[0]);
 99
                 sr.Close();
                 StreamReader sr2 = new StreamReader(path + "usermap.final");
                 while ((line = sr2.ReadLine()) != null)
                     string [] s = line. Split ('\t');
104
                     umap.Add(int.Parse(s[1]), s[0]);
```

```
sr2.Close();
                 StreamReader srw = new StreamReader(path + "itemmap.final");
                 while ((line = srw.ReadLine()) != null)
109
                     string [] s = line. Split ('\t');
                     map2.Add(s[0], s[1]);
                srw.Close();
114
                 StreamReader srw2 = new StreamReader(path + "usermap.final");
                 while ((line = srw2.ReadLine()) != null)
                     string [] s = line. Split('\t');
                     usermap2.Add(s[0], s[1]);
119
                 srw2.Close();
             bool loadTagId(string path)
124
                 string file = path + "catid";
                 StreamReader sr = new StreamReader(file);
                 string line = "";
                 while ((line = sr.ReadLine())!= null)
129
                     string [] s = line. Split ('\t');
                     tagidindex.Add(s[0].Trim(), int.Parse(s[1]));
                 sr.Close();
134
                 return true;
             bool loadAvaData(string path)
139
                 StreamReader sr1 = new StreamReader(path + "useraveandva");
                 string line = "";
                 while ((line = sr1.ReadLine())!= null)
                     string [] splits = line. Split (' \_');
144
                     userave. Add(splits [0], double. Parse(splits [1]));
                     userva.Add(splits [0], double.Parse(splits [2]));
                 }
                 sr1.Close();
149
                 StreamReader sr2 = new StreamReader(path + "itemaveandva");
                 while ((line = sr2.ReadLine()) != null)
                     string[] splits = line.Split(' ' ');
                     itemave.Add(splits [0], double.Parse(splits [1]));
154
                     itemva.Add(splits [0], double.Parse(splits [2]));
                 sr2.Close();
                 return true;
             }
159
             bool loadCountData(string path)
                 StreamReader sr1 = new StreamReader(path + "userreviewcount");
                 string line = "";
164
                 while ((line = sr1.ReadLine())!= null)
                     string [] splits = line. Split(' \_');
                     usercount.Add(splits [0], int.Parse(splits [1]));
169
                 sr1.Close();
                 StreamReader sr2 = new StreamReader(path + "itemreviewcount");
                 while ((line = sr2.ReadLine())!= null)
174
```

```
string [] splits = line. Split('_');
                     itemcount.Add(splits [0], int.Parse(splits [1]));
                 sr2.Close();
                 return true;
179
             bool loadBusinessNameData(string path)
                 StreamReader sr = new StreamReader(path + "businessNameData");
184
                 string line = "";
                 while ((line = sr.ReadLine()) != null)
                     string [ splits = line.Split(new string [ { " ||| " }, StringSplitOptions.None);
                     businessnameindex.Add(splits[0], int.Parse(splits[1]));
189
                 sr.Close();
                 StreamReader sr2 = new StreamReader(path + "businessNameData2");
                 while ((line = sr2.ReadLine())!= null)
194
                     string [ splits = line. Split (new string [ { " ||| " }, StringSplitOptions.None);
                     businessnameindex2.Add(splits[0], int.Parse(splits[1]));
                 sr2.Close();
199
                 return true;
             bool loadStreetNameData(string path)
204
                 StreamReader sr = new StreamReader(path + "streetname");
                 string line = "";
                 while ((line = sr.ReadLine())!= null)
                     string [ splits = line.Split(new string [ { " ||| " }, StringSplitOptions.None);
209
                     try
                     {
                         streetindex.Add(splits [0], int.Parse(splits [1]));
                     catch
214
                         //Console.WriteLine(splits [0]);
                 sr.Close();
219
                 return true;
             void loadWordCountData(string path)
224
                 string line = "";
                 StreamReader sr1 = new StreamReader(path + "usertext_count");
                 while ((line = sr1.ReadLine())!= null)
                     string [ splits = line. Split (new string [ { " |||| " }, StringSplitOptions. None);
229
                     userwordcount.Add(splits[0], int.Parse(splits[1]));
                 sr1.Close();
                 StreamReader sr2 = new StreamReader(path + "businesstext_count");
                 while ((line = sr2.ReadLine())!= null)
234
                     string [] splits = line. Split (new string [] { " |||| " }, StringSplitOptions. None);
                     businesswordcount.Add(splits[0], int.Parse(splits[1]));
                 sr2.Close();
239
             }
             void loadTopicData(string path)
```

```
string line = "":
244
                 StreamReader sr1 = new StreamReader(path + "user_topic");
                 while ((line = sr1.ReadLine()) != null)
                      line = line.Trim();
                     string [] splits = line. Split (new string [] { " |||| " }, StringSplitOptions. None);
249
                     List < double > tmp = new List < double > ();
                     string [] s = splits [1]. Split (' \_');
                     foreach (var v in s)
                         tmp.Add(double.Parse(v));
                     usertopic.Add(splits [0], tmp);
254
                 sr1.Close();
                 StreamReader sr2 = new StreamReader(path + "business_topic");
                 while ((line = sr2.ReadLine()) != null)
259
                      line = line.Trim();
                     string [] splits = line. Split (new string [] { " |||| " }, StringSplitOptions. None);
                     List < double > tmp = new List < double > ();
                      string [] s = splits [1]. Split (' "");
264
                     foreach (var v in s)
                          tmp.Add(double.Parse(v));
                     businesstopic.Add(splits [0], tmp);
                 }
                 sr2.Close();
269
             }
             void loadReviewTopicData(string path)
                 string line = "";
274
                 StreamReader sr1 = new StreamReader(path + "user_reviewtopic");
                 while ((line = sr1.ReadLine()) != null)
                      line = line.Trim();
                     string [ splits = line. Split (new string [ { " || || " }, StringSplitOptions. None);
279
                     List < double > tmp = new List < double > ();
                     string [] s = splits [1]. Split (' \_');
                     foreach (var v in s)
                          tmp.Add(double.Parse(v));
                     userreviewtopic. Add(splits [0], tmp);
284
                 sr1.Close();
                 StreamReader sr2 = new StreamReader(path + "business_reviewtopic");
                 while ((line = sr2.ReadLine()) != null)
289
                      line = line.Trim();
                      string [ splits = line. Split (new string [ { " || || " }, StringSplitOptions. None);
                      List < double > tmp = new List < double > ();
                      string [] s = splits [1]. Split (' \_');
294
                     foreach (var v in s)
                          tmp.Add(double.Parse(v));
                     businessreviewtopic. Add(splits [0], tmp);
                 sr2.Close();
299
             }
             void loadEmotionWords(string path)
                 StreamReader sr1 = new StreamReader(path + "user_emotionwords");
304
                 string line = "";
                 while ((line = sr1.ReadLine()) != null)
                      line = line.Trim();
                     string [] splits = line. Split (new string [] { " |||| " }, StringSplitOptions. None);
309
                     string [] s = splits [1]. Trim(). Split('\_');
```

```
List < double > t = new List < double > ();
                  foreach (var v in s)
                     t.Add(double.Parse(v));
                  useremotionwords.Add(splits[0], t);
314
              sr1.Close();
              StreamReader sr2 = new StreamReader(path + "user_emotionwords");
              while ((line = sr2.ReadLine()) != null)
319
                  line = line.Trim();
                  string [] splits = line. Split (new string [] { " ||| || " }, StringSplitOptions. None);
                  string [] s = splits [1]. Split (' \_');
                  List < double > t = new List < double > ();
324
                  foreach (var v in s)
                     t.Add(double.Parse(v));
                  itememotionwords.Add(splits[0], t);
              sr2.Close();
329
           bool loadUidIndex(string path)
334
               Console.WriteLine("-----");
              StreamReader sr = new StreamReader(path + "uid");
              string line = "";
              while ((line = sr.ReadLine()) != null)
339
                  string [] splits = line. Split (' \_');
                  uidindex.Add(splits [0], int.Parse(splits [1]));
              sr.Close();
344
              Console.WriteLine("-----");
              return true;
           }
           bool loadBidIndex(string path)
349
              Console.WriteLine("-----");
              StreamReader sr = new StreamReader(path + "bid");
              string line = "";
              while ((line = sr.ReadLine()) != null)
354
                  string [] splits = line.Split('_');
                  bidindex.Add(splits [0], int.Parse(splits [1]));
              sr.Close();
359
              Console.WriteLine("-----);
              return true;
           }
364
           bool loadTrainUserData(string path)
              Console.WriteLine("-----");
              StreamReader sr = new StreamReader(path + "yelp_training_set_user.json");
369
              string line = "";
              while ((line = sr.ReadLine())!= null)
                  JsonReader jr = new JsonTextReader(new StringReader(line));
374
                  userinfo uif = new userinfo();
                  string uid = "";
                  int i = 0;
                  while (jr.Read())
```

```
379
                       i++;
                        if (i == 5)
                           uif.votefun = int.Parse(jr.Value.ToString());
                           uif.voteuserful = int.Parse(jr.Value.ToString());
384
                        if (i == 9)
                           uif.votecool = int.Parse(jr.Value.ToString());
                        if (i == 12)
                           uid = jr.Value.ToString();
                        if (i == 14)
389
                           uif.name = jr.Value.ToString();
                        if (i == 16)
                           uif.avescore = double.Parse(jr.Value.ToString());
                          (i == 18)
394
                           uif.reviewcount = int.Parse(jr.Value.ToString());
                    userlist [uid] = uif;
399
                sr.Close();
                Console.WriteLine("-----loadingTrainUserDataOver----");
                return true;
            }
404
            bool loadTestUserData(string path)
                Console.WriteLine("-----");
                StreamReader sr = new StreamReader(path + "final_test_set_user.json");
                string line = "";
409
                while ((line = sr.ReadLine()) != null)
                   JsonReader jr = new JsonTextReader(new StringReader(line));
                   string lastline = "";
                   string uid = "";
                    userinfo uif = new userinfo();
                   while (jr.Read())
                        if (lastline == "review_count")
                           uif.reviewcount = int.Parse(jr.Value.ToString());
419
                        if (lastline == "name")
                           uif.name = jr.Value.ToString();
                        if (lastline == "average_stars")
                           uif.avescore = double.Parse(jr.Value.ToString());
                        if (lastline == "user_id")
424
                           uid = jr.Value.ToString();
                        if (jr.ValueType!= null)
                            lastline = jr. Value. ToString();
                    userlist [uid] = uif;
429
                }
                sr.Close();
                Console.WriteLine("-----");
                return true;
            }
434
            void loadUserData(string path)
                foreach (var v in uidindex.Keys)
439
                    userinfo uif = new userinfo();
                    userlist .Add(v, uif);
                loadTrainUserData(path + "yelp_training_set");
                loadTestUserData(path + "final\_test\_set");
444
            }
```

```
bool loadTrainBusinessData(string path)
449
                Console.WriteLine("-----loadingTrainBusinessData-----");
                StreamReader sr = new StreamReader(path + "yelp_training_set_business.json");
                string line = "";
                while ((line = sr.ReadLine())!= null)
454
                    JsonReader ir = new JsonTextReader(new StringReader(line));
                    businessinfo bif = new businessinfo();
                    string bid = "":
                    int i = 0;
459
                    string lastline = "";
                    while (jr.Read())
                        i++;
                        if (i == 3)
464
                            bid = jr.Value.ToString();
                        if (i == 5)
                            bif.address = jr.Value.ToString();
                        if (i == 7)
                            bif.isopen = bool.Parse(jr.Value.ToString());
469
                        if (lastline == "categories")
                            while (jr. ValueType != null && jr. Value. ToString()!= "city")
474
                               bif.categories.Add(jr.Value.ToString());
                               jr.Read();
                        if (lastline == "city")
479
                            bif.city = jr.Value.ToString();
                        if (lastline == "review_count")
                            bif.review_count = int.Parse(jr.Value.ToString());
484
                        if (lastline == "name")
                            bif.name = jr.Value.ToString();
                        if (lastline == "longitude")
                            bif.longitude = double.Parse(jr.Value.ToString());
                        if (lastline == "state")
489
                            bif.state = jr.Value.ToString();
                        if (lastline == "stars")
                            bif.stras = double.Parse(jr.Value.ToString());
494
                        if (lastline == "latitude")
                            bif.latitude = double.Parse(jr.Value.ToString());
                        if (jr. ValueType != null)
                            lastline = jr.Value.ToString();
499
                    businesslist [bid] = bif;
                };
                sr.Close();
504
                Console.WriteLine("-----");
                return true;
            }
            bool loadTestBusinessData(string path)
509
                Console.WriteLine("-----loadingTestBusinessData-----");
                StreamReader sr = new StreamReader(path + "final_test_set_business.json");
                string line = "";
                while ((line = sr.ReadLine())!= null)
514
```

```
JsonReader jr = new JsonTextReader(new StringReader(line));
                     businessinfo bif = new businessinfo();
                     string bid = "";
                     int i = 0;
519
                     string lastline = "";
                     while (jr.Read())
                         i++;
                         if (lastline == "business_id")
524
                             bid = jr.Value.ToString();
                         if (lastline == "full_address")
                             bif.address = jr.Value.ToString();
                         if (lastline == "open")
                             bif.isopen = bool.Parse(jr.Value.ToString());
529
                         if (lastline == "categories")
                             while (jr. ValueType != null && jr. Value. ToString() != "city")
                                 bif.categories.Add(jr.Value.ToString());
534
                                 jr.Read();
                         if (lastline == "city")
                             bif.city = jr.Value.ToString();
539
                         if (lastline == "review_count")
                             bif.review_count = int.Parse(jr.Value.ToString());
                         if (lastline == "name")
                             bif.name = jr.Value.ToString();
                           ///neighbor
544
                         if (lastline == "longitude")
                             bif.longitude = double.Parse(jr.Value.ToString());
                         if (lastline == "state")
                             bif.state = jr.Value.ToString();
                         if (lastline == "stars")
549
                             bif.stras = double.Parse(jr.Value.ToString());
                         if (lastline == "latitude")
                             bif.latitude = double.Parse(jr.Value.ToString());
                         if (jr. ValueType != null)
                             lastline = jr.Value.ToString();
554
                     businesslist [bid] = bif;
                 }
                 sr.Close();
                 path = "F:\yelp_RS\data\generated";
559
                 return true;
             }
             void loadBusinessData(string path)
564
                 foreach (var v in bidindex.Keys)
                     businessinfo bif = new businessinfo();
                     businesslist .Add(v, bif);
569
                 load Train Business Data (path\,+\,"yelp\_training\_set");
                 loadTestBusinessData(path + "final_test_set");
             }
574
             bool loadTrainReviewData(string path)
                 Console.WriteLine("-----loadingTrainReviewData----");
                 StreamReader sr = new StreamReader(path + "yelp_training_set_review.json");
579
                 string line = "";
                 while ((line = sr.ReadLine())!= null)
```

```
JsonReader jr = new JsonTextReader(new StringReader(line));
                     string lastline = "";
584
                     string rid = "";
                    datainfo dif = new datainfo();
                     while (jr.Read())
                         if (lastline == "funnny")
589
                             dif.votefun = int.Parse(jr.Value.ToString());
                         if (lastline == "useful")
                             dif.voteuserful = int.Parse(jr.Value.ToString());
                         if (lastline == "cool")
                             dif.votecool = int.Parse(jr.Value.ToString());
594
                         if (lastline == "user_id")
                             dif.uid = jr.Value.ToString();
                         if (lastline == "review_id")
                             rid = jr.Value.ToString();
                         if (lastline == "stars")
599
                             dif.stars = int.Parse(jr.Value.ToString());
                         if (lastline == "date")
                             dif.date = jr.Value.ToString();
                         if (lastline == "text")
                             dif.text = jr.Value.ToString();
604
                         if (lastline == "business_id")
                             dif.bid = jr.Value.ToString();
                         if (jr. ValueType != null)
                             lastline = jr. Value. ToString();
609
                    }
                     try
                     {
                         List < int > tmplist = new List < int > ();
614
                         tmplist.Add(bidindex[dif.bid]);
                         userreviewlist .Add(dif.uid, tmplist);
                    }
                    catch
                     {
619
                         userreviewlist [dif.uid]. Add(bidindex[dif.bid]);
                     }
                    try
                     {
624
                         List < int > tmplist = new List < int > ();
                         tmplist.Add(uidindex[dif.uid]);
                         itemreviewlist.Add(dif.bid, tmplist);
                    catch
629
                     {
                         itemreviewlist [ dif . bid ]. Add(uidindex[dif.uid]);
                     traindatalist . Add(rid, dif);
634
                sr.Close();
                 Console.WriteLine("-----loadingTrainReviewDataOver-----");
                 return true;
639
             }
             bool loadTrainCheckinData(string path)
                 Console.WriteLine("-----loadingTrainCheckinData-----");
                 StreamReader sr = new StreamReader(path + "yelp_training_set_checkin.json");
                 string line = "";
                 while ((line = sr.ReadLine()) != null)
                     JsonReader jr = new JsonTextReader(new StringReader(line));
649
                     string lastline = "";
```

```
string vid = "";
                     Dictionary<int, int> tmp = new Dictionary<int, int>();
                     for (int i = 0; i < 7 * 24; i++)
                         tmp.Add(i, 0);
654
                     int count = 0;
                     while (jr.Read())
                         if (lastline == "business_id")
                             vid = jr.Value.ToString();
659
                         if (jr.TokenType.ToString() == "Integer")
                             string [] s = lastline . Split ('-');
                             int time = 24 * int.Parse(s[1]) + int.Parse(s[0]);
                             tmp[time] = int.Parse(jr.Value.ToString());
664
                             count += int.Parse(jr.Value.ToString());
                         if (jr.ValueType!= null)
                              lastline = ir.Value.ToString();
669
                     traincheckinlist .Add(vid, tmp);
                     traincheckincount.Add(vid, count);
                 sr.Close();
674
                 Console.WriteLine("-----");
                 return true;
             bool loadTestReviewData(string path)
679
                 Console.WriteLine("-----");
                 StreamReader sr = new StreamReader(path + "test");
                 string line = "";
                 while ((line = sr.ReadLine())!= null)
684
                     string [] splits = line. Split(',');
                     datainfo dif = new datainfo();
                     dif.uid = splits [0];
                     dif.bid = splits [1];
689
                     dif.stars = int.Parse(splits [2]);
                     testdatalist .Add(dif);
                 sr.Close();
694
                 StreamReader sr1 = new StreamReader(path + "knownuser_knownitem");
                 while ((line = sr1.ReadLine())!= null)
                 {
                     \mathrm{string} \ [] \quad \mathrm{splits} \ = \mathrm{line.} \ \mathrm{Split} \ (\,{}^{\,\prime}\,,\,{}^{\,\prime}\,) \, ;
                     datainfo dif = new datainfo();
699
                     dif.uid = splits [0];
                     dif.bid = splits [1];
                     dif.stars = int.Parse(splits [2]);
                     testdatalist1 .Add(dif);
                 }
704
                 sr1.Close();
                 StreamReader sr2 = new StreamReader(path + "knownuser_newitem");
                 while ((line = sr2.ReadLine()) != null)
709
                     string[] splits = line.Split(',');
                     datainfo dif = new datainfo();
                     dif.uid = splits [0];
                     dif.bid = splits [1];
                     dif. stars = int. Parse(splits [2]);
714
                     testdatalist2 . Add(dif);
                 sr2.Close();
```

```
StreamReader sr3 = new StreamReader(path + "newuser_knownitem");
719
               while ((line = sr3.ReadLine())!= null)
                   string [] splits = line. Split(', ');
                   datainfo dif = new datainfo();
                   dif.uid = splits [0];
724
                   dif.bid = splits [1];
                   dif.stars = int.Parse(splits [2]);
                    testdatalist3.Add(dif);
               sr3.Close();
729
               StreamReader sr4 = new StreamReader(path + "newuser_newitem");
               while ((line = sr4.ReadLine())!= null)
                   string [] splits = line. Split(',');
734
                   datainfo dif = new datainfo();
                   dif.uid = splits [0];
                   dif.bid = splits [1];
                   dif. stars = int. Parse(splits [2]);
                    testdatalist4.Add(dif);
739
               sr4.Close();
               Console.WriteLine("----loadingTestReviewDataOver----");
               return true;
744
            bool loadTestCheckinData(string path)
               Console.WriteLine("-----");
749
               StreamReader sr = new StreamReader(path + "final_test_set_checkin.json");
               string line = "";
               while ((line = sr.ReadLine())!= null)
                   JsonReader jr = new JsonTextReader(new StringReader(line));
754
                   string lastline = "";
                   string vid = "";
                   int count = 0;
                   Dictionary<int, int> tmp = new Dictionary<int, int>();
                   for (int i = 0; i < 7 * 24; i++)
759
                       tmp.Add(i, 0);
                   while (jr.Read())
                       if (lastline == "business_id")
                           vid = jr.Value.ToString();
764
                       if (jr.TokenType.ToString() == "Integer")
                           string [] s = lastline . Split ('-');
                           int time = 24 * int.Parse(s[1]) + int.Parse(s[0]);
                           tmp[time] = int.Parse(jr.Value.ToString());
769
                           count += int.Parse(jr.Value.ToString());
                       if (jr.ValueType!= null)
                           lastline = jr.Value.ToString();
                    testcheckinlist .Add(vid, tmp);
                   testcheckincount.Add(vid, count);
               sr.Close();
               Console.WriteLine("-----");
779
               return true;
            void calCheckin()
784
               foreach (var v in traincheckinlist)
```

```
string key = v.Key;
                    Dictionary<int, int> hourtmp = new Dictionary<int, int>();
                    for (int i = 0; i < 24; i++)
                        hourtmp.Add(i, 0);
                    Dictionary<int, int> daytmp = new Dictionary<int, int>();
                    for (int i = 0; i < 7; i++)
794
                        daytmp.Add(i, 0);
                    foreach (var va in v. Value)
799
                        hourtmp[va.Key \% 24] += va.Value;
                        daytmp[va.Key / 24] += va.Value;
                    checkindaylist .Add(v.Key, daytmp);
                    checkinhourlist . Add(v.Key, hourtmp);
804
                foreach (var v in testcheckinlist)
                    string key = v.Key;
                    Dictionary<int, int> hourtmp = new Dictionary<int, int>();
809
                    for (int i = 0; i < 24; i++)
                    {
                        hourtmp.Add(i, 0);
                    Dictionary<int, int> daytmp = new Dictionary<int, int>();
814
                    for (int i = 0; i < 7; i++)
                        daytmp.Add(i, 0);
                    foreach (var va in v. Value)
819
                        hourtmp[va.Key \% 24] += va.Value;
                        daytmp[va.Key / 24] += va.Value;
                    checkindaylist .Add(v.Key, daytmp);
824
                    checkinhourlist.Add(v.Key, hourtmp);
                }
            }
            void loadGenerateData(string gepath)
            {
                loadTagId(gepath);\\
834
                loadAvaData(gepath);
                loadCountData(gepath);
                loadBusinessNameData(gepath);
                loadStreetNameData(gepath);
                loadWordCountData(gepath);
839
                loadTopicData(gepath);
                loadReviewTopicData(gepath);
                loadEmotionWords(gepath);
            }
844
            Dictionary<string, int> nameid = new Dictionary<string, int>();
            Dictionary<string, int> namecount = new Dictionary<string, int>();
            bool generatBusinessNameData(string path)
                StreamWriter sw = new StreamWriter(path + "businessNameData");
849
                int id = 0;
                foreach (var v in businesslist)
                    string name = v.Value.name;
854
                    try
```

```
string [] names = v.Value.name.Split('_');
                         name = names[0].Trim();
                     catch { }
859
                     \operatorname{try}
                     {
                         nameid.Add(name, id);
                         namecount.Add(name, 1);
                         id++;
864
                     }
                     catch
                     {
                         namecount[name]++;
869
                 foreach (var item in nameid.OrderBy(s => s.Key))
                     sw.WriteLine(item.Key + "|||" + item.Value);//+ "|||" +
874
                 }
                 sw.Close();
                 return true;
             }
879
             void loadJiaobenjunData(string path)
                 string line = "";
                 path = "F:\Dropbox\RecSysChallenge\Features";
                 StreamReader sriva = new StreamReader(path + "i//Liang_ItemCategories.txt");
884
                 line = sriva.ReadLine();
                 while ((line = sriva.ReadLine())!= null)
                     string [] splits = line. Split('\t');
                     List < int > tmp = new List < int > ();
                     for (int i = 1; i < \text{splits.Length} - 1; i++)
                          string [] s = splits [i]. Split (':');
                         tmp.Add(int.Parse(s[0]));
894
                     tmp.Sort();
                     jbica.Add(map[int.Parse(splits[0])], tmp);
                 sriva.Close();
899
                 StreamReader sric = new StreamReader(path + "i//Liang_ItemCity.txt");
                 line = sric.ReadLine();
                 while ((line = sric.ReadLine())!= null)
                     string [] splits = line. Split ('\t');
904
                     string [] s = splits [1]. Split (':');
                     jbitemcity.Add(map[int.Parse(splits[0])], int.Parse(s[0]));
                 }
                 sric .Close();
909
                 StreamReader srir = new StreamReader(path + "i//Liang_ItemReview.txt");
                 line = srir.ReadLine();
                 while ((line = srir.ReadLine())!= null)
                     string [] splits = line. Split('\t');
914
                     string [] s = splits [1]. Split (':');
                     jbitemreview. Add(map[int.Parse(splits[0])], \;\; int.Parse(s[0]));\\
                 srir .Close();
919
                 StreamReader sris = new StreamReader(path + "i//Liang_ItemState.txt");
                 line = sris.ReadLine();
                 while ((line = sris.ReadLine())!= null)
```

```
string [] splits = line. Split('\t');
924
                     string [] s = splits [1]. Split (':');
                     jbitemstate.Add(map[int.Parse(splits[0])], int.Parse(s[0]));
                 sris .Close();
929
                 StreamReader srlat = new StreamReader(path + "i//Liang_ItemLatitude.txt");
                 line = srlat.ReadLine();
                 while ((line = srlat.ReadLine())!= null)
                     string [] splits = line. Split('\t');
934
                     string [] s = splits [1]. Split (':');
                     jblantdic.Add(map[int.Parse(splits[0])], int.Parse(s[0]));
                 srlat .Close();
939
                 StreamReader srlon = new StreamReader(path + "i//Liang_ItemLongitude.txt");
                 line = srlon.ReadLine();
                 while ((line = srlon.ReadLine())!= null)
                     string [] splits = line. Split('\t');
944
                     string [] s = splits [1]. Split (':');
                     jblongdic.Add(map[int.Parse(splits[0])], int.Parse(s[0]));
                 }
                 srlon.Close();
949
                 StreamReader srlocation = new StreamReader(path + "i//Liang_ItemLocation.txt");
                 line = srlocation.ReadLine();
                 while ((line = srlocation.ReadLine()) != null)
                     string [] splits = line. Split('\t');
954
                     string [] s = splits [1]. Split (':');
                     jblocationdic . Add(map[int.Parse(splits[0])], int.Parse(s[0]));
                 srlocation.Close();
959
                 StreamReader srstreet = new StreamReader(path + "i//Qiang_1264_Street.txt");
                 line = srstreet.ReadLine();
                 while ((line = srstreet.ReadLine())!= null)
                     string [] splits = line. Split('\t');
964
                     string [] s = splits [1]. Split (':');
                     jbstreetdic . Add(map[int.Parse(splits[0])], int.Parse(s[0]));
                 srstreet .Close();
969
                 StreamReader srqbn = new StreamReader(path + "i//Qiang_9998_BusinessName_Normalized.txt");
                 line = srqbn.ReadLine();
                 while ((line = srqbn.ReadLine())!= null)
                 {
                     string [] splits = line. Split('\t');
974
                     string [] s = splits [1]. Split (':');
                     jbqbn.Add(map[int.Parse(splits[0])], int.Parse(s[0]));
                 srqbn.Close();
979
                 StreamReader srzipcode = new StreamReader(path + "i//Qiang_197_zipcode.txt");
                 line = srzipcode.ReadLine();
                 while ((line = srzipcode.ReadLine())!= null)
                     string [] splits = line. Split ('\t');
984
                     string [] s = splits [1]. Split (':');
                     jbzipcodedic.Add(map[int.Parse(splits[0])], int.Parse(s[0]));
                 srzipcode.Close();
989
                 StreamReader srlug = new StreamReader(path + "u//Liang_UserGender.txt");
```

```
line = srlug.ReadLine();
                  while ((line = srlug.ReadLine())!= null)
                      string [] splits = line. Split ('\t');
994
                      string [] s = splits [1]. Split (':');
                     jbusergender.Add(umap[int.Parse(splits[0])], int.Parse(s[0]));
                  srlug.Close();
999
                  StreamReader srlunl = new StreamReader(path + "u//Liang_UserNameLen.txt");
                  line = srlunl.ReadLine();
                  while ((line = srlunl.ReadLine())!= null)
                      string [] splits = line. Split('\t');
1004
                      string [] s = splits [1]. Split (':');
                     jbusernamelen.Add(umap[int.Parse(splits[0])], int.Parse(s[0]));
                  srlunl.Close();
1009
                  StreamReader srlur = new StreamReader(path + "u//Liang_UserReview.txt");
                  line = srlur.ReadLine();
                  while ((line = srlur.ReadLine())!= null)
                      string [] splits = line. Split ('\t');
1014
                      string [] s = splits [1]. Split (':');
                     jbuserreview.Add(umap[int.Parse(splits[0])], int.Parse(s[0]));
                  srlur.Close();
1019
                  StreamReader srtimebin = new StreamReader(path + "ui//Liang_UserItemTimeBin.txt");
                  line = srtimebin.ReadLine();
                  while ((line = srtimebin.ReadLine())!= null)
                      string [] splits = line. Split('\t');
1024
                      string [] s = splits [2]. Split (':');
                     jbusertimebindic.Add(umap[int.Parse(splits[0])] + map[int.Parse(splits[1])], int.Parse(s[0]));
                  srtimebin.Close();
                  StreamReader srsname = new StreamReader(path + "i/xudong_streetname.txt");
1029
                  line = srsname.ReadLine();
                  while ((line = srsname.ReadLine())!= null)
                      string [] splits = line. Split('\t');
                      string [] s = splits [1]. Split (':');
1034
                     streetnameindex.Add(map[int.Parse(splits[0])], int.Parse(s[0]));
                  srsname.Close();
              }
1039
              bool calAveScore(string path)
                  StreamWriter\ sw1 = \underset{}{new}\ StreamWriter(path\ +\ "userave and va");
                  StreamWriter sw2 = new StreamWriter(path + "itemaveandva");
1044
                  double sum = 0;
                  double sum2 = 0;
                  foreach (var v in userreviewlist)
                     sum = 0;
1049
                     sum 2 = 0;
                     foreach (var va in v. Value)
                         sum += (double)va;
                         sum2 += (double)va * va;
1054
                     double ave = sum / v.Value.Count;
                     double var = sum2 / v.Value.Count - ave * ave;
                     sw1.WriteLine(v.Key + "" + ave + "" + var);
```

```
1059
                  foreach (var v in itemreviewlist)
                     sum = 0;
                     sum2 = 0;
                      foreach (var va in v. Value)
1064
                          sum += (double)va;
                          sum2 += (double)va * va;
                     double ave = sum / v.Value.Count;
1069
                     double var = sum2 / v.Value.Count - ave * ave;
                     sw2.WriteLine(v.Key + "\perp" + ave + "\perp" + var);
                  sw1.Close();
                  sw2.Close();
1074
                  return true;
              void featureGenerator(string path)
1079
                  StreamWriter swuserglobleave = new StreamWriter(path + "features//globle_user_ave");
                  Dictionary < string, int > userglobleave = new Dictionary < string, int > ();
                  foreach (var v in userlist)
                  {
                      userglobleave.Add(usermap2[v.Kev], (int)(v.Value.avescore / 0.2));
1084
                  foreach (var v in userglobleave)
                     swuserglobleave. WriteLine(v.Key + "\t" + v.Value + ":1");
                  swuserglobleave.Close();
1089
                  StreamWriter swusercount = new StreamWriter(path + "features//globle_user_count");
                  Dictionary<string, int> usercount = new Dictionary<string, int>();
                  foreach (var v in userlist)
                      usercount.Add(usermap2[v.Key], (int)(Math.Log(v.Value.reviewcount + 1) / 0.1));
1094
                  foreach (var v in usercount)
                     swusercount.WriteLine(v.Key + "\t" + v.Value + ":1");
                  swusercount.Close();
1099
                  StreamWriter swbusinessave = new StreamWriter(path + "features//globle_business_ave");
                  Dictionary\langle string, int \rangle businessave = new Dictionary\langle string, int \rangle();
                  foreach (var v in businesslist)
                  {
                      businessave. Add(map2[v.Key], (int)(v.Value.stras / 0.2));
1104
                  foreach (var v in businessave)
                     swbusinessave.WriteLine(v.Key + "\t" + v.Value + ":1");
                  swbusinessave.Close();
1109
                  StreamWriter swbusinesscount = new StreamWriter(path + "features//globle_business_count");
                  Dictionary<string, int> businesscount = new Dictionary<string, int>();
                  foreach (var v in businesslist)
                     businesscount.Add(map2[v.Key], (int)(Math.Log(v.Value.review_count + 1) / 0.1));
1114
                  foreach (var v in businesscount)
                     swbusinesscount.WriteLine(v.Key + "\t" + v.Value + ":1");
                  swbusinesscount.Close();
1119
                  StreamWriter sw1 = new StreamWriter("F:\yelp_RS\data\features\checkin\_hour");
                  StreamWriter sw2 = new StreamWriter(@"F:\yelp_RS\data\features\checkin_day");
                  sw1.WriteLine(24);
                  sw2.WriteLine(7);
                  foreach (var v in checkinhourlist)
1124
                      StringBuilder sb = new StringBuilder();
```

```
sb.Append(map2[v.Key] + "\t");
                     for (int i = 0; i < 24; i++)
1129
                         if (v.Value[i] > 5)
                         {
                             double value = Math.Min(1, (double)(v.Value[i]) / 200);
                             sb.Append(i).Append(":").Append(value).Append("\t");
                         }
1134
                     sw1.WriteLine(sb.ToString());
                 foreach (var v in checkindaylist)
1139
                     StringBuilder sb = new StringBuilder();
                     sb.Append(map2[v.Kev] + "\t");
                     for (int i = 0; i < 7; i++)
                         if (v.Value[i] > 5)
1144
                             double value = Math.Min(1, (double)(v.Value[i]) / 200);
                             sb.Append(i).Append(":").Append(value).Append("\t");
1149
                     sw2.WriteLine(sb.ToString());
                 }
                 sw1.Close();
                 sw2.Close();
                 StreamWriter sw3 = new StreamWriter(@"F:\yelp_RS\data\features\checkin_count");
1154
                 sw3.WriteLine(301);
                 foreach (var v in traincheckincount)
                     StringBuilder sb = new StringBuilder();
                     sb.Append(map2[v.Key] + "\t");
1159
                     int reviewcount = traincheckincount[v.Key];
                     reviewcount = Math.Min(reviewcount, 3000);
                     reviewcount = 10;
                     sb.Append(reviewcount).Append(":1_");
                     sw3.WriteLine(sb.ToString());
1164
                 foreach (var v in testcheckincount)
                     StringBuilder sb = new StringBuilder();
                     sb.Append(map2[v.Key] + "\t");
1169
                     int reviewcount = testcheckincount[v.Key];
                     reviewcount = Math.Min(reviewcount, 3000);
                     reviewcount = 10;
                     sb.Append(reviewcount).Append(":1_");
                     sw3.WriteLine(sb.ToString());
1174
                 sw3.Close();
                 StreamWriter sw4 = new StreamWriter(@"F:\yelp_RS\data\features\streetname");
                 StreamWriter sw5 = new StreamWriter(@"F:\yelp_RS\data\features\businessname");
1179
                 StreamWriter \ sw6 = \underline{new} \ StreamWriter (@"F:\yelp\_RS\data\features\votecool");
                 StreamWriter sw7 = new StreamWriter(@"F:\yelp_RS\data\features\votefun");
                 StreamWriter sw8 = new StreamWriter(@"F:\yelp_RS\data\features\voteuseful");
                 foreach (var v in businesslist)
1184
                     StringBuilder sb = new StringBuilder();
                     sb.Append(map2[v.Key] + "\t");
                     string fulladdress = v.Value.address;
                     int start = fulladdress.LastIndexOf("\n");
                     if (start == -1)
1189
                         start = 0;
                     int end = fulladdress.IndexOf(", \_AZ");
                     if (end == -1)
                         end = fulladdress.IndexOf(",");
                     string streetname = fulladdress.Substring(start, end - start).Trim();
1194
```

```
sb.Append(streetindex[streetname]).Append(":1_");
                      sw4.WriteLine(sb.ToString());
                  foreach (var v in businesslist)
1199
                      StringBuilder sb = new StringBuilder();
                      sb.Append(map2[v.Key] + "\t");
                      \operatorname{try}
                      {
                          string name = v.Value.name;
1204
                          string [] names = v.Value.name.Split('\_');
                          name = names[0].Trim();
                          sb.Append(businessnameindex[name] + ":1");
                          sw5.WriteLine(sb.ToString());
1209
                      catch
                  foreach (var v in userlist)
1214
                      StringBuilder sb = new StringBuilder();
                      sb.Append(usermap2[v.Key] + "\t");
                      int fun = (int)(100 * Math.Log((v.Value.votecool + 1)));
                      sb.Append(fun).Append(":1_");
1219
                      sw6.WriteLine(sb.ToString());
                  foreach (var v in userlist)
                      StringBuilder sb = new StringBuilder();
1224
                      sb.Append(usermap2[v.Key] + "\t");
                      int fun = (int)(100 * Math.Log((v.Value.votefun + 1)));
                      sb.Append(fun).Append(":1_");
                      sw7.WriteLine(sb.ToString());
1229
                  foreach (var v in userlist)
                      StringBuilder sb = new StringBuilder();
                      sb.Append(usermap2[v.Key] + "\t");
                      int fun = (int)(100 * Math.Log((v.Value.voteuserful + 1)));
1234
                      sb.Append(fun).Append(":1_");
                      sw8.WriteLine(sb.ToString());
                  sw4.Close();
                  sw5.Close();
1239
                  sw6.Close();
                  sw7.Close();
                  sw8.Close();
              }
1244
              void generateTextData()
              {
                  Dictionary<string, List<string>> usertextdic = new Dictionary<string, List<string>>();
                  Dictionary<string, List<string>> businesstextdic = new Dictionary<string, List<string>>();
                  foreach (var v in traindatalist)
1249
                      string uid = v.Value.uid;
                      string bid = v.Value.bid;
                      string text = v.Value.text;
1254
                      string [] splits = text.Split (new char[3] { '\_', '\setminusn', '\setminusr' });
                      for (int i = 0; i < \text{splits.Length}; i++)
                          try
                          {
1259
                               List < string > t = new List < string > ();
                              t.Add(splits[i]);
                               usertextdic.Add(uid, t);
```

```
}
                          catch
1264
                          {
                              usertextdic [uid]. Add(splits[i]);
                          }
                          try
                          {
1269
                              List < string > t = new List < string > ();
                              t.Add(splits[i]);
                              businesstextdic.Add(bid, t);
                          }
                          catch
1274
                              businesstextdic[bid]. Add(splits[i]);
                          }
                     }
1279
                  StreamWriter sw1 = new StreamWriter(@"F:\yelp_RS\data\exp\usertext");
                  foreach (var v in usertextdic)
                      List < string > t = v.Value;
                     t.Sort();
1284
                     StringBuilder sb = new StringBuilder();
                     sb.Append(v.Key + "||||");
                      foreach (var va in t)
                          sb.Append(va).Append("");
                     sw1.WriteLine(sb.ToString());
1289
                  }
                  sw1.Close();
                  StreamWriter sw2 = new StreamWriter(@"F:\yelp_RS\data\exp\businesstext");
                  foreach (var v in businesstextdic)
1294
                      List < string > t = v.Value;
                     t.Sort();
                     StringBuilder sb = new StringBuilder();
                     sb.Append(v.Key + "||||");
                      foreach (var va in t)
1299
                          sb.Append(va).Append("_");
                     sw2.WriteLine(sb.ToString());
                  sw2.Close();
1304
              public Dictionary < string, int > biabusinessname = new Dictionary < string, int > ();
              public Dictionary < string, int > bialocation = new Dictionary < string, int > ();
              public Dictionary<string, int> bialat = new Dictionary<string, int>();
1309
              public Dictionary<string, int> bialon = new Dictionary<string, int>();
              public Dictionary<string, int> biazipcode = new Dictionary<string, int>();
              void loadBiasData()
              {
                  string path = @"F:\Dropbox\RecSysChallenge\Features\i";
1314
                  string line = "";
                  StreamReader srbname = new StreamReader(path + "Qiang_9998_BusinessName_Normalized.txt");
                  line = srbname.ReadLine();
                  while ((line = srbname.ReadLine()) != null)
1319
                      string [] splits = line. Split ('\t');
                      string [] s = splits [1]. Split (':');
                     biabusinessname.Add(map[int.Parse(splits[0])], int.Parse(s[0]));
                  srbname.Close();
1324
                  StreamReader srzipcode = new StreamReader(path + "Qiang_197_zipcode.txt");
                  line = srzipcode.ReadLine();
                  while ((line = srzipcode.ReadLine())!= null)
1329
                      string [] splits = line. Split('\t');
```

```
string [] s = splits [1]. Split (':');
                      biazipcode.Add(map[int.Parse(splits[0])], int.Parse(s[0]));
                  srzipcode.Close();
1334
                  StreamReader srlocation = new StreamReader(path + "Liang ItemLocation.txt");
                  line = srlocation.ReadLine();
                  while ((line = srlocation.ReadLine())!= null)
1339
                      string [] splits = line. Split('\t');
                      string [] s = splits [1]. Split (':');
                      bialocation. Add(map[int.Parse(splits[0])], int.Parse(s[0]));
                  }
                  srlocation . Close();
1344
                  StreamReader srlat = new StreamReader(path + "Liang_ItemLatitude.txt");
                  line = srlat.ReadLine();
                  while ((line = srlat.ReadLine())!= null)
1349
                      string [] splits = line. Split('\t');
                      string [] s = splits [1]. Split (':');
                      bialat.Add(map[int.Parse(splits[0])], int.Parse(s[0]));
                  srlat .Close();
1354
                  StreamReader srlon = new StreamReader(path + "Liang_ItemLocation.txt");
                  line = srlon.ReadLine();
                  while ((line = srlon.ReadLine())!= null)
                      string [] splits = line. Split('\t');
1359
                      string [] s = splits [1]. Split (':');
                      bialon.Add(map[int.Parse(splits[0])], int.Parse(s[0]));
                  srlon.Close();
              }
1364
              public void run(string path)
                  string gepath = path + "generated";
                  string trainpath = path + "yelp_training_set";
1369
                  string testpath = path + "final_test_set";
                  loadMap(path + "features");
1374
                  loadUidIndex(trainpath);
                  loadBidIndex(trainpath);
                  loadUserData(path);
                  loadBusinessData(path);
                  loadTrainReviewData(trainpath);
1379
                  loadTrainCheckinData(trainpath);
                  loadTestReviewData(testpath);
                  loadTestCheckinData(testpath);
                  calCheckin();
1384
                  loadGenerateData(gepath);
                  ////from
                  loadJiaobenjunData(path + "jbfeature");
1389
                  loadBiasData();
             }
         }
1394
```

• Feature Generator 2.cs generate files for models from raw data.

```
using System;
   using System.Collections.Generic;
   using System.Ling;
   using System. Text;
   using System.IO;
   using Newtonsoft.Json;
   using yelpRS.dataset.details;
   using yelp_RS.dataset;
   using yelpRS.dataset;
   namespace yelp_RS.dataset
       public class FeatureGenerator2
15
           double globelave = 3.7667;
           double uservaave = 0.5091;
           double itemvaave = 1.1485;
           double maxlon = -111.2635082;
           double minlon = -112.875482;
20
           double maxlat = 34.002867;
           double minlat = 32.876848;
           int maxfun = 24519;
            int maxuseful = 24293;
            int maxcool = 122410;
25
           int maxreviewcount = 22977;
           int maxuserreviewcount = 5807;
            string generatOneline(DataSet2 ds, datainfo dif, LoadTopicData ltd)
30
               string uid = dif.uid;
               string bid = dif.bid;
               int featuresum = 1;
               StringBuilder sb = new StringBuilder();
                //user id
               sb.Append(ds.uidindex[uid] + featuresum).Append(":1\_");
               featuresum += ds.uidindex.Count + 1;
                ///business id
               sb.Append(ds.bidindex[bid] + featuresum).Append(":1_");
               featuresum += ds.bidindex.Count + 1;
40
               string line = sb.ToString();
               return line;
45
           string generatOneline2(DataSet2 ds, datainfo dif, LoadTopicData ltd)
               string uid = dif.uid;
               string bid = dif.bid;
               int featuresum = 1;
50
               StringBuilder sb = new StringBuilder();
                //user id
               sb.Append(ds.uidindex[uid]).Append("");
                   /business id
               sb.Append(ds.bidindex[bid]).Append("_");
                //userfeature
                //globlereviewcount
               int ucount = 0;
               ucount = (int)(Math.Log(ds.userlist[uid].reviewcount + 1) / 0.1);
               sb.Append(ucount + featuresum).Append(":1\_");
60
               featuresum += 120;
                ///businessfeature
                if (ds. businesslist [bid]. isopen)
                   sb.Append(featuresum + 1).Append(":1_");
65
                   sb.Append(featuresum + 2).Append(":1");
               featuresum += 3;
                ///globlereviewcount
```

```
int bcount = 0;
                 bcount = (int)(Math.Log(ds.businesslist[bid].review_count + 1) / 0.1);
 70
                 sb.Append(bcount + featuresum).Append(":1_");
                 featuresum += 170;
                 List < int > tagidlist = new List < int > ();
                 int tagcount = 0;
 75
                 \operatorname{try}
                 {
                      foreach (var v in ds. businesslist [bid]. categories)
                          tagidlist .Add(ds.tagidindex[v]);
 80
                          \operatorname{try}
                              if (ds.jbcattypedic[v] == 1)
 85
                                  tagcount++;
                          }
                          catch { }
                      tagidlist .Sort();
                     foreach (var v in tagidlist)
                          sb.Append(featuresum + v).Append(":1_");
                 }
                 catch { }
 95
                 featuresum += 1000;
                  ///timebin
                 int timebin = ds.jbusertimebindic[uid + bid];
                 sb.Append(featuresum + timebin).Append(":1\_");
                 featuresum += 22;
100
                  ///checkincount
                 int review count = 0;
                 try
                 {
105
                     reviewcount = ds.traincheckincount[bid];
                 }
                 catch
                     try
110
                      {
                          reviewcount = ds.testcheckincount[bid];
                     catch { }
115
                 reviewcount = Math.Min(reviewcount, 3000);
                 reviewcount = 10;
                 sb.Append(featuresum + reviewcount).Append(":1_");
                 featuresum += 305;
120
                 //ckinhour&day
                 \operatorname{try}
                 {
                      for (int i = 0; i < 24; i++)
125
                      {
                          if (ds. checkinhourlist [bid][i] > 10)
                              double value = Math.Min(1, (double)ds.checkinhourlist[bid][i] / 200);
                              sb.Append(featuresum + i).Append(":").Append(value).Append("");
                          }
130
                      }
                 }
                 catch { }
                 featuresum += 26;
                 try
135
```

```
for (int i = 0; i < 7; i++)
                            (ds. checkindaylist [bid][i] > 10)
                         if
                         {
140
                             double value = Math.Min(1, (double)ds.checkindaylist[bid][i] / 200);
                            sb.Append(featuresum + i).Append(":").Append(value).Append("\");
                    }
                 }
145
                 catch { }
                 featuresum += 10;
                 ///vote
                 try
150
                     int fun = (int)(100 * Math.Log((ds.userlist[uid].votefun + 1)));
                    sb.Append(featuresum + fun).Append(":1_");
                 catch
155
                 { }
                 featuresum += 1015;
                 try
                 {
                     int fun = (int)(100 * Math.Log((ds.userlist[uid].voteuserful + 1)));
160
                    sb.Append(featuresum + fun).Append(":1_");
                 }
                 catch
                 { }
                 featuresum += 1015;
165
                 try
                 {
                     int fun = (int)(100 * Math.Log((ds.userlist[uid].votecool + 1)));
                    sb.Append(featuresum + fun).Append(":1_");
                 }
170
                 catch
                 { }
                 featuresum += 1005;
                 //text&businessnam&streetname
175
                 //businessname
                 string fullname = "";
                 {\rm string \ name} = "";
                 fullname = ds. businesslist [bid]. name. Trim();
                 string [] names = fullname.Split('\_');
180
                 name = names[0].Trim();
                try
                 {
                    sb.Append(featuresum + ds.businessnameindex[name] + ":1\");
                 }
185
                 catch
                 {
                     Console. WriteLine(name);
                 featuresum += 5314;
190
                 sb.Append(featuresum + ds.streetnameindex[bid]).Append(":1_");
                 featuresum += 88;
195
                 sb.Append(featuresum + ds.jblantdic[bid]).Append(":1_");
                 featuresum += 52;
                 sb.Append(featuresum + ds.jblongdic[bid]).Append(":1_");
                 featuresum += 52;
                 sb.Append(featuresum + ds.jblocationdic[bid]).Append(":1_");
200
                 featuresum += 52;
                 sb.Append(featuresum + ds.jbzipcodedic[bid]).Append(":1_");
                featuresum += 200;
```

```
//topic
205
                 \operatorname{try}
                 {
                     List < double > usertopic = ds.userreviewtopic[uid];
                     for (int i = 0; i < usertopic.Count; i++)
210
                         sb.Append(featuresum + i).Append(":").Append(usertopic[i]).Append("");
                     }
                 }
                 catch
215
                 featuresum += 6;
                 //businesstopic
220
                 try
                 {
                      List < double > businesstopic = ds.businessreviewtopic[bid];
                     for (int i = 0; i < businesstopic.Count; <math>i++)
225
                         sb.Append(featuresum + i).Append(":").Append(businesstopic[i]).Append("");
                 }
                 catch { }
                 featuresum += 6;
230
                 string line = sb.ToString();
                 return line;
             string generatOneline3(DataSet2 ds, datainfo dif, LoadTopicData ltd)
235
                 string uid = dif.uid;
                 string bid = dif.bid;
                 StringBuilder sb = new StringBuilder();
                 //userfeature
240
                 double uscore = 0;
                 try
                     uscore = ((double)ds. userlist [uid]. avescore / 5);
245
                 catch
                 {
                     uscore = ((double)globelave / 5);
250
                 sb.Append(uscore + 0.0001).Append("");
                 ///businessfeature
                  if (ds. businesslist [bid]. isopen)
                     sb.Append("0.5\_");
255
                     sb.Append("1");
                 ///timebin
                 double timebin = (double)ds.jbusertimebindic[uid + bid] / 20;
                 sb.Append(timebin + 0.0001).Append("\_");
                 //ckinhour&day
                 \operatorname{try}
                      for (int i = 0; i < 24; i++)
265
                     {
                         double value = Math.Min(1, (double)ds.checkinhourlist[bid][i] / 200);
                         sb.Append(value + 0.0001).Append("\_");
                 }
270
                 catch
```

```
for (int i = 0; i < 24; i++)
                         sb.Append("0.0001_");
275
                 //text&businessnam&streetname
                  //streetname
                 sb.Append((double)ds.streetnameindex[bid] / 86).Append(""");
280
                 sb.Append((double)ds.jblantdic[bid] / 50 + 0.0001).Append(""");
                 sb.Append((double)ds.jblongdic[bid] / 50 + 0.0001).Append(""");
                 sb.Append((double)ds.jblocationdic[bid] / 50 + 0.0001).Append("",");
285
                 sb.Append((double)ds.jbzipcodedic[bid] / 197 + 0.0001).Append("_");
                 sb.Append((double)ds.jbitemcity[bid] / 69 + 0.0001).Append("");
                 sb.Append((double)ds.jbitemreview[bid] / 51 + 0.0001).Append("");
                 sb.Append((double)ds.jbitemstate[bid] / 4 + 0.0001).Append("");
                 sb.Append((double)ds.jbusergender[uid] / 3 + 0.0001).Append("");
290
                 try
                 {
                     sb.Append(ds.jbusernamelen[uid] / 26 + 0.0001).Append(""");
                 catch
295
                 {
                     sb.Append("0.5");
                 }
                 try
                 {
300
                     sb.Append((double)ds.jbuserreview[uid] / 51 + 0.0001).Append("");
                 }
                 catch
                 {
                     sb.Append("0.00001_");
305
                 }
                 //topic
                 try
                     List < double > usertopic = ds.userreviewtopic[uid];
310
                     for (int i = 0; i < usertopic.Count; i++)
                         sb.Append(usertopic[i] + 0.0001).Append("\_");
315
                 catch
                     sb.Append("0.2\_0.2\_0.2\_0.2\_0.2\_");
320
                 //businesstopic
                 try
                 {
                     List < double > businesstopic = ds.businessreviewtopic[bid];
                     for (int i = 0; i < businesstopic.Count; <math>i++)
325
                         sb.Append(businesstopic[i] + 0.0001).Append("\");
                 }
                 catch
330
                 {
                     sb.Append("0.2_0.2_0.2_0.2_0.2_0.2;");
                 string line = sb.ToString();
                 return line;
335
             }
             string generatOneline4(DataSet2 ds, datainfo dif, LoadTopicData ltd)
                 string uid = dif.uid;
340
```

```
string bid = dif.bid;
                 int featuresum = 1;
                 StringBuilder sb = new StringBuilder();
                 sb.Append(ds.uidindex[uid]).Append("_");
345
                 ///business id
                 sb.Append(ds.bidindex[bid]).Append("",");
                 //bias
                 sb.Append(ds.biabusinessname[bid]).Append("");
                 sb.Append(ds.bialat[bid]).Append("_");
350
                 sb.Append(ds.bialon[bid]).Append("");
                 sb.Append(ds.bialocation[bid]).Append("");
                 sb.Append(ds.biazipcode[bid]);
                 //user id
                 sb.Append("|||");
355
                 sb.Append(ds.uidindex[uid] + featuresum).Append(":1_");
                 featuresum += ds.uidindex.Count + 1;
                 ///business id
                 sb.Append(ds.bidindex[bid] + featuresum).Append(":1_");
                 featuresum += ds.bidindex.Count + 1;
360
                 //userfeature
                 int uscore = 0;
                 try
                 {
                     uscore = (int)(ds. userlist [uid]. avescore / 0.2);
365
                 }
                 catch
                 {
                     uscore = (int)(globelave / 0.2);
370
                 sb.Append(uscore + featuresum).Append(":1\_");
                 featuresum += 27;
                 ///businessfeature
                 if (ds. businesslist [bid]. isopen)
375
                     sb.Append(featuresum + 1).Append(":1\_");
                 else
                     sb.Append(featuresum + 2).Append(":1\_");
                 featuresum += 3;
380
                 List < int > tagidlist = new List < int > ();
                 int tagcount = 0;
                 try
                 {
                     foreach (var v in ds. businesslist [bid]. categories)
385
                         tagidlist .Add(ds.tagidindex[v]);
                         try
                         {
                                (ds.jbcattypedic[v] == 1)
390
                                 tagcount++;
                             }
                         }
395
                         catch { }
                     tagidlist .Sort();
                     foreach (var v in tagidlist)
                         sb.Append(featuresum + v).Append(":1");
400
                 catch { }
                 featuresum += 1000;
                 ///timebin
405
                 int timebin = ds.jbusertimebindic[uid + bid];
                 sb.Append(featuresum + timebin).Append(":1_");
                 featuresum += 22;
```

```
//ckinhour&day
                 try
410
                 {
                     for (int i = 0; i < 24; i++)
                         if (ds. checkinhourlist [bid][i] > 10)
415
                             double value = Math.Min(1, (double)ds.checkinhourlist[bid][i] / 200);
                             sb.Append(featuresum + i).Append(":").Append(value).Append("\_");
                         }
                 }
420
                 catch { }
                 featuresum += 26;
                 try
                 {
                     for (int i = 0; i < 7; i++)
425
                         if (ds. checkindaylist [bid][i] > 10)
                             double value = Math.Min(1, (double)ds.checkindaylist[bid][i] / 200);
                             sb.Append(featuresum + i).Append(":").Append(value).Append("\");
430
                 }
                 {\rm catch}\ \{\ \}
                 featuresum += 10;
435
                 ///vote
                 try
                 {
                     int fun = (int)(100 * Math.Log((ds.userlist[uid].votefun + 1)));
440
                     sb.Append(featuresum + fun).Append(":1\_");
                 }
                 catch
                 { }
                 featuresum += 1200;
445
                 try
                 {
                     int fun = (int)(100 * Math.Log((ds.userlist[uid].voteuserful + 1)));
                     sb.Append(featuresum + fun).Append(":1\_");
450
                 catch
                 { }
                 featuresum += 1200;
                 try
                 {
455
                     int fun = (int)(100 * Math.Log((ds.userlist[uid].votecool + 1)));
                     sb.Append(featuresum + fun).Append(":1\_");
                 }
                 catch
                 { }
460
                 featuresum += 1200;
                 //text&businessnam&streetname
                  /businessname
                 string fullname = "";
465
                 string name = "";
                 fullname = ds. businesslist [bid]. name. Trim();
                 string [] names = fullname.Split('_');
                 name = names[0].Trim();
470
                 try
                     sb.Append(featuresum + ds.businessnameindex[name] + ":1_");
                 }
                 catch
475
                     Console.WriteLine(name);
```

```
featuresum += 5314;
                 //streetname
                 sb.Append(featuresum + ds.streetnameindex[bid]).Append(":1\_");
480
                 featuresum += 88;
                 sb.Append(featuresum + ds.jblantdic[bid]).Append(":1_");
                 featuresum += 52;
                 sb.Append(featuresum + ds.jblongdic[bid]).Append(":1_");
485
                 featuresum += 52;
                 sb.Append(featuresum + ds.jblocationdic[bid]).Append(":1_");
                 featuresum += 52:
                 sb.Append(featuresum + ds.jbzipcodedic[bid]).Append(":1_");
                 featuresum += 200;
490
                 sb.Append(featuresum + ds.jbitemcity[bid]).Append(":1_");
                 featuresum += 71;
                 sb.Append(featuresum + ds.jbitemreview[bid]).Append(":1_");
                 featuresum += 54;
                 sb.Append(featuresum + ds.jbitemstate[bid]).Append(":1_");
495
                 featuresum += 6;
                 //sb.Append(featuresum + ds.jbqch[bid]).Append(":1");
                 //\text{featuresum} += 23;
                 sb.Append(featuresum + ds.jbqbn[bid]).Append(":1_");
                 featuresum += 10000;
500
                 sb.Append(featuresum + ds.jbusergender[uid]).Append(":1_");
                 featuresum += 4;
                 try
                 {
                    sb.Append(featuresum + ds.jbusernamelen[uid]).Append(":1_");
505
                 catch { }
                 featuresum += 28;
                try
                 {
510
                    sb.Append(featuresum + ds.jbuserreview[uid]).Append(":1_");
                 }
                 catch { }
                 featuresum += 54;
                 //topic
515
                 try
                     List < double > usertopic = ds.userreviewtopic[uid];
                     for (int i = 0; i < usertopic.Count; i++)
520
                          '/if (usertopic[i] > 0.3)
                        sb.Append(featuresum + i).Append(":").Append(usertopic[i]).Append(".");
                 catch
525
                 {
                 featuresum += 6;
                 //businesstopic
                 try
530
                 {
                     List < double > businesstopic = ds.businessreviewtopic[bid];
                     for (int i = 0; i < businesstopic.Count; <math>i++)
                          f (businesstopic [i] > 0.3)
535
                        sb.Append(featuresum + i).Append(":").Append(businesstopic[i]).Append("");
                    }
                 }
                 catch { }
                 featuresum += 6;
540
                 string line = sb.ToString();
                 return line;
```

```
string generatOnelinebac(DataSet2 ds, datainfo dif, LoadTopicData ltd)
                 string uid = dif.uid;
                 string bid = dif.bid;
                 int featuresum = 1;
550
                 StringBuilder sb = new StringBuilder();
                 //user id
                 sb.Append(ds.uidindex[uid] + featuresum).Append(":1_");
                 featuresum += ds.uidindex.Count + 1;
                 ///business id
555
                 sb.Append(ds.bidindex[bid] + featuresum).Append(":1_");
                 featuresum += ds.bidindex.Count + 1;
                 ///globlereviewcount
                 int ucount = 0;
                 ucount = (int)(Math.Log(ds.userlist[uid].reviewcount + 1) / 0.1);
560
                 sb.Append(ucount + featuresum).Append(":1_");
                 featuresum += 120;
                 int bcount = 0:
                 bcount = (int)(Math.Log(ds.businesslist[bid].review\_count + 1) / 0.1);
                 sb.Append(bcount + featuresum).Append(":1_");
565
                 featuresum += 170;
                 List < int > tagidlist = new List < int > ();
                 int tagcount = 0;
                 try
570
                 {
                     foreach (var v in ds. businesslist [bid]. categories)
                         tagidlist .Add(ds.tagidindex[v]);
                         try
575
                         {
                             if (ds.jbcattypedic[v] == 1)
                                 tagcount++;
580
                         }
                         catch { }
                     }
                     tagidlist .Sort();
585
                     foreach (var v in tagidlist)
                         sb.Append(featuresum + v).Append(":1");
                 }
                 catch { }
                 featuresum += 1000;
590
                 ///checkincount
                 int review count = 0;
                 try
                 {
595
                     reviewcount = ds.traincheckincount[bid];
                 }
                catch
                 {
600
                     try
                     {
                         reviewcount = ds.testcheckincount[bid];
                     catch { }
                 }
605
                 reviewcount = Math.Min(reviewcount, 3000);
                 reviewcount = 10;
                 sb.Append(featuresum + reviewcount).Append(":1_");
                 featuresum += 305;
610
                 //ckinhour&day
                 try
```

545

```
for (int i = 0; i < 24; i++)
615
                         if
                           (ds. checkinhourlist [bid][i] > 10)
                         {
                             double value = Math.Min(1, (double)ds.checkinhourlist[bid][i] / 200);
                             sb.Append(featuresum + i).Append(":").Append(value).Append("\");
                         }
620
                 }
                 catch { }
                 featuresum += 26;
                 try
625
                     for (int i = 0; i < 7; i++)
                         if (ds. checkindaylist [bid][i] > 10)
                         {
630
                             double value = Math.Min(1, (double)ds.checkindaylist[bid][i] / 200);
                             sb.Append(featuresum + i).Append(":").Append(value).Append("\");
635
                 catch { }
                 featuresum += 10;
                 ///vote
640
                 try
                 {
                     int fun = (int)(100 * Math.Log((ds.userlist[uid].votefun + 1)));
                     sb.Append(featuresum + fun).Append(":1_");
                 }
645
                catch
                 { }
                 featuresum += 1015;
                 try
                 {
650
                     int fun = (int)(100 * Math.Log((ds.userlist[uid].voteuserful + 1)));
                     sb.Append(featuresum + fun).Append(":1\_");
                 }
                 catch
655
                 { }
                 featuresum += 1015;
                 try
                     int fun = (int)(100 * Math.Log((ds.userlist[uid].votecool + 1)));
                     sb.Append(featuresum + fun).Append(":1\_");
660
                 }
                 catch
                 { }
                 featuresum += 1005;
665
                 //text&businessnam&streetname
                  //businessname
                 string \ fullname = "";
                 string name = "";
                 fullname = ds. businesslist [bid]. name.Trim();
670
                 string [] names = fullname.Split('_');
                 name = names[0].Trim();
                 try
                 {
                     sb.Append(featuresum + ds.businessnameindex[name] + ":1_");
675
                 }
                catch
                     Console.WriteLine(name);
680
```

```
featuresum += 5314;
               sb.Append(featuresum + ds.streetnameindex[bid]).Append(":1_");
               featuresum += 88:
685
               sb.Append(featuresum + ds.jblantdic[bid]).Append(":1_");
               featuresum += 52;
               sb.Append(featuresum + ds.jblongdic[bid]).Append(":1_");
               featuresum += 52;
               sb.Append(featuresum + ds.jblocationdic[bid]).Append(":1_");
690
               featuresum += 52:
               sb.Append(featuresum + ds.jbzipcodedic[bid]).Append(":1_");
               featuresum += 200:
               string line = sb.ToString();
695
               return line;
            void trainDataGenerator(DataSet2 ds, string path, LoadTopicData ltd)
700
               Console.WriteLine("-----TrainDataGenerating----");
               StreamWriter sw = new StreamWriter(path + "train");
               foreach (var v in ds. traindatalist)
                   string line = v.Value.stars + "_";
705
                   line += generatOneline4(ds, v.Value, ltd);
                   sw.WriteLine(line);
               }
               sw.Close();
710
               Console.WriteLine("-----TrainDataGeneratingOver----");
            void testDataGenerator(DataSet2 ds, string path, LoadTopicData ltd)
715
               Console.WriteLine("-----TestDataGenerating-----");
               StreamWriter sw = new StreamWriter(path + "test");
               foreach (var v in ds. testdatalist)
                   string line = v.stars + "_{-}";
720
                   line += generatOneline4(ds, v, ltd);
                   sw.WriteLine(line);
               sw.Close();
725
               Console.WriteLine("-----");
            void blendingDataGenerator(DataSet2 ds, string path, LoadTopicData ltd)
730
                string rpath = @"F:\
                                       \yelp_RS\data\yelp_training_set";
               Console.WriteLine("----BlendingTrainDataGenerating----");
               for (int i = 1; i <= 7; i++)
735
                   string \ filename = rpath + "blendingfile \setminus local\_final\_train\_set\_review\_" + i + ".json";
                   string testfilename = rpath + "blendingfile\\ local_final_test_set_review_" + i + ".json";
                   string outfilename = path + "feature\\blending2\\train" + i;
                   string testoutfilename = path + "feature\\blending2\\test" + i;
                   StreamReader sr = new StreamReader(filename);
740
                   StreamReader sr2 = new StreamReader(testfilename);
                   StreamWriter sw = new StreamWriter(outfilename);
                   StreamWriter sw2 = new StreamWriter(testoutfilename);
                   string line = "";
                   while ((line = sr.ReadLine())!= null)
745
                       JsonReader jr = new JsonTextReader(new StringReader(line));
                       string lastline = "";
```

```
datainfo dif = new datainfo();
750
                         while (jr.Read())
                             if (lastline == "review_id")
                                 rid = jr.Value.ToString();
                             if (jr. ValueType!= null)
755
                                 lastline = jr. Value. ToString();
                         string newline = ds. traindatalist [rid]. stars + "\bot";
                         newline += generatOneline4(ds, ds.traindatalist[rid], ltd);
                         sw.WriteLine(newline);
760
                     while ((line = sr2.ReadLine()) != null)
                         JsonReader jr = new JsonTextReader(new StringReader(line));
                         string lastline = "";
765
                         string rid = "";
                         datainfo dif = new datainfo();
                         while (jr.Read())
                             if (lastline == "review_id")
770
                                 rid = jr. Value. ToString();
                             if (jr. ValueType!= null)
                                  lastline = jr.Value.ToString();
                         }
                         string newline = ds. traindatalist [rid]. stars + "\bot";
775
                         newline += generatOneline4(ds, ds.traindatalist[rid], ltd);
                         sw2.WriteLine(newline);
                     sr.Close();
                     sr2.Close();
780
                     sw.Close();
                     sw2.Close();
                 Console.WriteLine("----BlendingTrainDataGeneratingOver----");
             }
785
             public void run(DataSet2 ds, string path, LoadTopicData ltd)
                 trainDataGenerator(ds, path + "feature", ltd);
                 testDataGenerator(ds, path + "feature", ltd);
790
                 blendingDataGenerator(ds, path, ltd);
  \bullet \ \ Linear SVD Model.cs
     a linear svd model.
      using System;
     using System.Collections.Generic;
     using System.Linq;
     using System. Text;
     using System.IO;
     namespace LinearSVD
         public class Record
             public int UserId { set; get; }
 11
             public int ItemId { set; get; }
             public double Rating { set; get; }
             public double GEPredict { set; get; }
             public List<int> BiasID { set; get; }
 16
             public double Predict { set; get; }
```

string rid = "";

```
public Dictionary<int, double> feature { set; get; }
           public Record(int u, int m, double r, Dictionary<int, double> f)
21
                this.UserId = u;
               this .ItemId = m;
               this .Rating = r;
               this feature = f;
26
           public Record(int u, int m, double r, List<int> bias, Dictionary<int, double> f)
               this.UserId = u;
31
               this .ItemId = m;
               this .Rating = r;
                this.BiasID = bias;
               this . feature = f;
36
       public class LinearSVDModel
           private const int STEP = 300;
           private double weight = 0;
           private const int K = 2;
           private double lr = 0.016;
           private const double reg = 0.004;
46
           private double alpha = 1;
           private const double beta = 0.003;
           private List<Record> train = new List<Record>();
51
           private List<Record> test = new List<Record>();
           private int USER\_CNT = 0;
           private int ITEM_CNT = 0;
           private int FEATURE_CNT = 0;
56
           private double MAX_RATING = 0;
           private double MIN_RATING = 0;
           private double mean = 0;
           private double [] bu;
61
           private double bi ;
           private double[,] p;
           private double[,] q ;
           private double [] b;
           private double bm;
           Random \_rand = new Random();
           private double _rand_init()
71
               return (\_rand.NextDouble() -0.5) / 10000;
           private int LoadRatingData(string trainfile, string testfile)
76
               int maxucnt = 0;
               int maxicnt = 0;
               int maxfcnt = 0;
               double maxrating = 0;
81
               double minrating = 100000;
               try
                   using (StreamReader sr = new StreamReader(trainfile))
```

```
Console.WriteLine("=======loading_Train_Data=======");
                         string line = "";
                         while ((line = sr.ReadLine()) != null)
                             line = line.Trim();
91
                             string [] splits = line. Split ('-');
                             int uid = int. Parse(splits [1]);
                             if (uid > maxucnt) maxucnt = uid;
                             int iid = int. Parse(splits [2]);
                             if (iid > maxicnt) maxicnt = iid;
                            double rating = double.Parse(splits [0]);
                             if (rating > maxrating) maxrating = rating;
                             if (rating < minrating) minrating = rating;
                            Dictionary<int, double> tmpdic = new Dictionary<int, double>();
                             for (int i = 3; i < splits.Length; i++)
101
                                string [] segs = splits [i]. Split (':');
                                tmpdic.Add(int.Parse(segs[0]), double.Parse(segs[1]));
                                if ((i == splits.Length - 1) && (int.Parse(segs[0]) > maxfcnt))
                                    maxfcnt = int.Parse(segs[0]);
106
                             train.Add(new Record(uid, iid, rating, tmpdic));
                         Console.WriteLine("=========loading_Train_Data_Over======");
                    }
111
                }
                        { return 1; }
                catch
                \operatorname{try}
                {
                    using (StreamReader sr = new StreamReader(testfile))
116
                     {
                         Console.WriteLine("=========loading_Test_Data========");
                         string line = "";
                        while ((line = sr.ReadLine())!= null)
121
                             line = line.Trim();
                             string [] splits = line. Split (' \_');
                             int uid = int.Parse(splits [1]);
                             if (uid > maxucnt) maxucnt = uid;
                             int iid = int.Parse(splits [2]);
126
                             if (iid > maxicnt) maxicnt = iid;
                            double rating = double.Parse(splits [0]);
                             if (rating > maxrating) maxrating = rating;
                             if (rating < minrating) minrating = rating;
                            Dictionary<int, double> tmpdic = new Dictionary<int, double>();
131
                             for (int i = 3; i < \text{splits.Length}; i++)
                                string [] segs = splits [i]. Split (':');
                                tmpdic.Add(int.Parse(segs[0]), double.Parse(segs[1]));
                                if ((i == splits.Length - 1) \&\& (int.Parse(segs[0]) > maxfcnt))
136
                                    maxfcnt = int.Parse(segs[0]);
                             test.Add(new Record(uid, iid, rating, tmpdic));
                        }
                    }
141
                catch { return 2; }
                Console.WriteLine("========loading_Test_Data_Over======");
                Console.WriteLine("\max_{UID:L}" + (\max_{UID:L}" + (\max_{UID:L}");
                Console.WriteLine("\max_{IID:L}" + (\max_{IID:L}" + (\max_{IID:L}");
146
                Console.WriteLine("FEATURE_CONUT:_{-}" + (maxfcnt + 1).ToString());
                Console.WriteLine("max_Rating:_" + maxrating);
                Console.WriteLine("min_Rating:_" + minrating);
                USER\_CNT = maxucnt;
                ITEM_CNT = maxicnt;
151
                FEATURE\_CNT = maxfcnt + 1;
                MAX_RATING = maxrating;
                MIN_RATING = minrating;
```

```
return 0;
            }
156
            private void Initialize ()
                bu = new double[USER\_CNT + 1];
                bi = new double[ITEM\_CNT + 1];
161
                p = new double[USER\_CNT + 1, K];
                q = new double[ITEM\_CNT + 1, K];
                b = new double[FEATURE\_CNT + 1];
                mean = train.Sum(x => x.Rating) / train.Count;
                for (int u = 0; u \le USER_CNT; u++)
166
                   bu[u] = \_rand\_init();
                    for (int k = 0; k < K; k++)
                       p[u, k] = \_rand\_init();
171
                for (int i = 0; i \le ITEM_CNT; i++)
                   bi[i] = \_rand\_init();
176
                    for (int k = 0; k < K; k++)
                       q[i, k] = \_rand\_init();
181
                bm = \_rand\_init();
                for (int i = 0; i \le FEATURE\_CNT; i++)
                   b[i] = 0;
186
            }
            private double Predict(Record r)
                int u = r.UserId;
191
                int i = r.ItemId;
                double \text{ sydpred} = mean + bu[u] + bi[i];
                for (int k = 0; k < K; k++)
                   svdpred += p[u, k] * q[i, k];
196
                svdpred = Math.Max(svdpred, MIN_RATING);
                svdpred = Math.Min(svdpred, MAX_RATING);
                double logit = 0;
                foreach (var v in r.feature)
201
                    logit += b[v.Key] * v.Value;
                double linearpred = mean + bm + MAX_RATING * (1 / (1 + Math.Exp(-1 * logit)));
                linearpred = Math.Max(linearpred, MIN_RATING);
206
                linearpred = Math.Min(linearpred, MAX_RATING);
                return (weight * sydpred + (1.0 - weight) * linearpred);
            }
211
            private void Train()
                Console.WriteLine("==============");
                for (int s = 0; s < STEP; s++)
216
                   double rn = 1 / (Math.Sqrt((double)(1 + FEATURE\_CNT)));
                   double train_rmse = 0;
                   double test_rmse = 0;
                   for each (Record r in train. OrderBy(x => Guid.NewGuid()))
221
                       int user = r.UserId;
```

```
int item = r.ItemId;
                          double rui = r.Rating;
                          Dictionary<int, double> f = r.feature;
                          double pui = Predict(r);
226
                          double eui = rui - pui;
                          \mathrm{bu[user]} \ += \mathrm{lr} * (\mathrm{eui} \ - \mathrm{reg} * \mathrm{bu[user]}) \, ;
                          bi[item] += lr * (eui - reg * bi[item]);
                          for (int k = 0; k < K; k++)
231
                              p[user, k] += lr * (eui * q[item, k] - reg * p[user, k]);
                              q[item, k] += lr * (eui * p[user, k] - reg * q[item, k]);
                          }
                          bm += alpha * (eui - beta * bm);
236
                          foreach (var v in f)
                              b[v.Key] += alpha * (eui * v.Value * rn - beta * b[v.Key]);
241
                      lr *= 0.9;
                      alpha *= 0.95;
                      foreach (Record r in train)
246
                          double pui = Predict(r);
                          double eui = r.Rating - pui;
                          train\_rmse += eui * eui;
                      foreach (Record r in test)
251
                          double pui = Predict(r);
                          double eui = r.Rating - pui;
                          test\_rmse += eui * eui;
256
                      Console.WriteLine("{0}\t{1}\t{2}", s, Math.Sqrt(train_rmse / train.Count), Math.Sqrt(test_rmse / test.Count)
             }
             private void WriteToFile(string outfile)
261
                 try
                  {
                      StreamWriter sw = new StreamWriter(outfile);
                      foreach (var v in test)
266
                          sw.WriteLine(Predict(v));
                      sw.Close();
^{271}
                 catch { Console.WriteLine("Write_to_File_Error"); }
             }
             public void run(string trainfile, string testfile, string outfile)
276
                 int loaddatainfo = LoadRatingData(trainfile, testfile);
                  if (loaddatainfo == 1)
                 {
                      Console.WriteLine("Loading_TrainData_Error:");
281
                 else if (loaddatainfo == 2)
                 {
                      Console.WriteLine("Loading_TestData_Error:");
                 }
                 else
286
                 {
                      Initialize ();
                      Train();
```

```
if (outfile != null)
291
                        WriteToFile(outfile);
                }
            }
        }
296
  \bullet Linear Bias SVD Model. cs
    a linear svd model adding biases.
      using System;
    using System.Collections.Generic;
    using System.Linq;
    using System. Text;
    using System.IO;
    namespace LinearSVD
        public class LinearBiasSVDModel
            private const int STEP = 300;
            private const int BIAS_CNT = 10;
 13
            private double weight = 0;
            private const int K = 1;
            private double lr = 0.016;
            private const double reg = 0.004;
 18
            private double alpha = 1;
            private const double beta = 0.003;
             private List<Record> train = new List<Record>();
 23
            private List<Record> test = new List<Record>();
            private int USER\_CNT = 0;
            private int ITEM\_CNT = 0;
            private int FEATURE_CNT = 0;
 28
            private double MAX_RATING = 0;
            private double MIN_RATING = 0;
            private int [] MAX_BIAS;
            private int BIAS\_COUNT = 0;
 33
            private double mean = 0;
            private double[] bu;
             private double [] bi;
            private double [,] p;
            private double [,] q;
 38
            private List<double[]> bias = new List<double[]>();
            private double [] b;
            private double bm;
            private double bs;
            Random \_rand = new Random();
             private double _rand_init()
                return (\_rand.NextDouble() - 0.5) / 100000;
            private int LoadRatingData(string trainfile, string testfile)
 53
                int maxucnt = 0;
                int maxicnt = 0;
                int maxfcnt = 0;
```

```
double maxrating = 0;
                double minrating = 100000;
                int [] maxbias = new int[BIAS_CNT];
                for (int i = 0; i < BIAS\_CNT; i++)
                    \max [i] = 0;
                int featurekind = 0;
63
                try
                    using (StreamReader sr = new StreamReader(trainfile))
                        Console.WriteLine("========loading_Train_Data=======");
                        string line = "";
68
                        while ((line = sr.ReadLine())!= null)
                            line = line.Trim();
                            string [ parts = line. Split (new string [ { " ||| " }, StringSplitOptions.None);
                            string [] splits = parts [0]. Trim(). Split('^{\prime}');
73
                            int uid = int. Parse(splits [1]);
                            if (uid > maxucnt) maxucnt = uid;
                            int iid = int. Parse(splits [2]);
                            if (iid > maxicnt) maxicnt = iid;
                            double rating = double.Parse(splits [0]);
                            if (rating > maxrating) maxrating = rating;
                            if (rating < minrating) minrating = rating;
                            List < int > tmplist = new List < int > ();
                            featurekind = splits. Length -3;
                            if (splits.Length!= 3)
 83
                            {
                                for (int i = 3; i < \text{splits.Length}; i++)
                                {
                                    if (int.Parse(splits[i]) > maxbias[i-3])
                                        \text{maxbias}[i - 3] = \text{int.Parse(splits [i])};
88
                                    tmplist.Add(int.Parse(splits[i]));
                            }
93
                            string [] splits2 = parts [1]. Trim(). Split('_');
                            Dictionary<int, double> tmpdic = new Dictionary<int, double>();
                            for (int i = 0; i < \text{splits2.Length}; i++)
                                string [] segs = splits2[i]. Split(':');
                                tmpdic.Add(int.Parse(segs[0]), double.Parse(segs[1]));
                                if ((i == splits2.Length - 1) \&\& (int.Parse(segs[0]) > maxfcnt))
                                    maxfcnt = int.Parse(segs[0]);
                            train.Add(new Record(uid, iid, rating, tmplist, tmpdic));
103
                        Console.WriteLine("========loading_Train_Data_Over======");
                }
                catch { return 1; }
108
                try
                {
                    using (StreamReader sr = new StreamReader(testfile))
                    {
                        113
                        string line = "";
                        while ((line = sr.ReadLine())!= null)
                            line = line.Trim();
                            string [] parts = line. Split (new string [] { " ||| " }, StringSplitOptions.None);
118
                            string [] splits = parts [0]. Trim(). Split('\_');
                            int uid = int.Parse(splits [1]);
                            if (uid > maxucnt) maxucnt = uid;
                            int iid = int.Parse(splits [2]);
                            if (iid > maxicnt) maxicnt = iid;
123
                            double rating = double.Parse(splits [0]);
```

```
if (rating > maxrating) maxrating = rating;
                             if (rating < minrating) minrating = rating;
                             List < int > tmplist = new List < int > ();
                             if (splits.Length!= 3)
128
                             {
                                 for (int i = 3; i < \text{splits.Length}; i++)
                                     if (int.Parse(splits[i]) > maxbias[i-3])
                                         \max [i - 3] = int. Parse(splits[i]);
133
                                     tmplist.Add(int.Parse(splits[i]));
                             }
138
                             string [] splits2 = parts [1]. Trim(). Split('-');
                             Dictionary\langle int, double \rangle tmpdic = new Dictionary\langle int, double \rangle();
                             for (int i = 0; i < \text{splits2.Length}; i++)
                             {
                                 string [] segs = splits2[i]. Split(':');
143
                                 tmpdic.Add(int.Parse(segs[0]), double.Parse(segs[1]));
                                 if ((i == splits2.Length - 1) && (int.Parse(segs[0]) > maxfcnt))
                                     maxfcnt = int.Parse(segs[0]);
                             test.Add(new Record(uid, iid, rating, tmplist, tmpdic));
148
                         }
                    }
                }
                catch { return 2; }
                Console.WriteLine("========loading_Test_Data_Over======");
153
                Console.WriteLine("max_UID:_" + (maxucnt));
                Console.WriteLine("\max_{IID:L}" + (\max_{IID:L}" + (\max_{IID:L}");
                Console.WriteLine("FEATURE_CONUT:_" + (maxfcnt + 1).ToString());
                Console.WriteLine("max_Rating:_" + maxrating);
                Console.WriteLine("min_Rating:_" + minrating);
158
                Console.WriteLine("Bias_CNT:_" + featurekind);
                USER\_CNT = maxucnt;
                ITEM\_CNT = maxicnt;
                FEATURE\_CNT = maxfcnt + 1;
                MAX_RATING = maxrating;
163
                MIN_RATING = minrating;
                 if (featurekind != 0)
                    BIAS\_COUNT = featurekind;
                    MAX_BIAS = new int[featurekind];
168
                     for (int i = 0; i < \text{featurekind}; i++)
                         MAX_BIAS[i] = maxbias[i];
                }
173
                return 0;
            }
            private void Initialize ()
178
                bu = new double[USER\_CNT + 1];
                bi = new double[ITEM\_CNT + 1];
                p = new double[USER\_CNT + 1, K];
                q = new double[ITEM\_CNT + 1, K];
                b = new double[FEATURE\_CNT + 1];
183
                if (BIAS_COUNT != 0)
                     for (int i = 0; i < BIAS\_COUNT; i++)
                         double[] t = new double[MAX_BIAS[i] + 1];
188
                         for (int bia = 0; bia < MAX_BIAS[i] + 1; bia++)
                             t[bia] = \_rand\_init();
                         bias.Add(t);
                    }
```

```
mean = train.Sum(x => x.Rating) / train.Count;
               for (int u = 0; u \le USER\_CNT; u++)
198
                   bu[u] = \_rand\_init();
                   for (int k = 0; k < K; k++)
                       p[u, k] = \_rand\_init();
203
               for (int i = 0; i \le ITEM\_CNT; i++)
                   bi[i] = \_rand\_init();
                   for (int k = 0; k < K; k++)
208
                       q[i, k] = \_rand\_init();
               bm = \_rand\_init();
213
               bs = \_rand\_init();
               for (int i = 0; i \le FEATURE\_CNT; i++)
                   b[i] = 0;
218
               }
           }
            private double Predict(Record r)
223
               int u = r.UserId;
               int i = r.ItemId;
               List < int > bia = r.BiasID;
               double svdpred = mean + bs + bu[u] + bi[i];
               for (int b = 0; b < BIAS\_COUNT; b++)
228
                   svdpred += bias[b][bia[b]];
               for (int k = 0; k < K; k++)
233
                   svdpred += p[u, k] * q[i, k];
               double logit = 0;
               foreach (var v in r.feature)
238
               {
                   logit += b[v.Key] * v.Value;
               double linearpred = logit;
243
               double re = (weight * sydpred + (1.0 - weight) * linearpred);
               re = Math.Max(re, MIN\_RATING);
               re = Math.Min(re, MAX\_RATING);
               return re;
            private void Train()
               253
               for (int s = 0; s < STEP; s++)
                   double rn = 1 / (Math.Sqrt((double)(1 + FEATURE\_CNT)));
                   double train_rmse = 0;
                   double test_rmse = 0;
258
                   for each (Record \ r \ in \ train.OrderBy(x => Guid.NewGuid()))
```

}

193

```
int user = r.UserId;
                         int item = r.ItemId;
                         double rui = r.Rating;
263
                         List < int > bia = r.BiasID;
                         Dictionary<int, double> f = r.feature;
                         double pui = Predict(r);
                         double eui = rui - pui;
                         bu[user] += lr * (eui - reg * bu[user]);
268
                         bi[item] += lr * (eui - reg * bi[item]);
                         for (int i = 0; i < BIAS\_COUNT; i++)
                             bias[i][bia[i]] += lr * (eui - reg * bias[i][bia[i]]);
273
                         for (int k = 0; k < K; k++)
                             p[user, k] += lr * (eui * q[item, k] - reg * p[user, k]);
                             q[item, k] += lr * (eui * p[user, k] - reg * q[item, k]);
278
                         bs += alpha * (eui - beta * bs);
                         bm += alpha * (eui - beta * bm);
                         foreach (var v in f)
                             b[v.Key] += alpha * (eui * v.Value * rn - beta * b[v.Key]);
                         }
                     lr *= 0.95;
                     alpha *= 0.95;
288
                     foreach (Record r in train)
                         double pui = Predict(r);
                         double eui = r.Rating - pui;
293
                         train\_rmse += eui * eui;
                     foreach (Record r in test)
                         double pui = Predict(r);
298
                         double eui = r.Rating - pui;
                         test\_rmse += eui * eui;
                     Console.WriteLine("{0}\t{1}\t{2}", s, Math.Sqrt(train_rmse / train.Count), Math.Sqrt(test_rmse / test.Count)
                 }
303
             private void WriteToFile(string outfile)
308
                 try
                 {
                     StreamWriter sw = new StreamWriter(outfile);
                     foreach (var v in test)
                         sw.WriteLine(Predict(v));
313
                     sw.Close();
                 catch { Console.WriteLine("Write_to_File_Error"); }
             }
318
             public void run(string trainfile, string testfile, string outfile)
                 int loaddatainfo = LoadRatingData(trainfile, testfile);
                 if (loaddatainfo == 1)
323
                     Console.WriteLine("Loading_TrainData_Error:");
                 else if (loaddatainfo == 2)
```

```
328
                     Console.WriteLine("Loading_TestData_Error:");
                 }
                 else
                 {
                      Initialize ();
333
                     Train();
                     if (outfile != null)
                         WriteToFile(outfile);
                     }
338
                 }
             }
     }
  • test_ensemble.py
     for test ensemble.
     import numpy as np
     import os
     e0 = 3.99428
     X_pred = []
     y_rmse = []
     list_dirs = os.walk("SUBMITTED")
     for root, dirs, files in list_dirs:
         for f in files:
             preds = [float(r.replace(",",'\t').split('\t')[1]) \ for \ r \ in \ file("SUBMITTED/" + f)]
             rmse = float(f)
             X_pred.append(preds)
 13
             y\_rmse.append(rmse)
     X_{pred} = np.matrix(X_{pred}).T
     print X_pred[0]
     print X_pred.shape
     Z = np.matrix(X_pred)
     N,M = Z.shape
    p1 = (Z.T * Z + 0.000006 * np.eye(M)).I
     zmr = []
     for m in range(M):
         zm = np.array(X_pred[:,m].T)[0]
         zm\_square = np.dot(zm, zm)
         r_square = N * e0 * e0
         nem = N * y\_rmse[m] * y\_rmse[m]
         a = (r_square + zm_square - nem) / 2
         zmr.append(a)
 33
     zmr = np.matrix(zmr).T
     w = p1 * zmr
     for i in zip(w,y_rmse):
         print i
     ensemle\_pred = np.array((Z * w).T)[0]
     \mathrm{fp} \, = \mathrm{open}("\mathrm{out"}, 'w')
     for p in ensemle_pred:
         p = max(p,1)
         p = min(p,5)
         print >> fp, p
     fp.close()
  • crossJoin.py
     for cross join features.
```

```
import os
```

```
def cross(filename1, filename2, outfilename):
        fin1 = open(filename1)
        fin2 = open(filename2)
        featurecount1 = int(fin1.readline().strip())
        featurecount2 = int(fin2.readline().strip())
        rawfeature1 = dict()
        rawfeature2 = dict()
        while 1:
             line1 = fin1. readline(). strip()
             line2 = fin2. readline(). strip()
             if not line1:
                 break
14
             parts1 = line1. split('\t')
             f = parts1[1]. strip(). split(':')[0]
             rawfeature1[int(parts1[0])] = float(f)
             parts2 = line2. split('\t')
             f = parts2[1]. strip(). split(':')[0]
19
             rawfeature2[int(parts2[0])] = float(f)
        generate featue = dict()
        featuremap = dict()
        for k, v1 in rawfeature1.items():
             v2 = rawfeature2[k]
24
             generatefeatue [k] = v1 * feature count 2 + v2
             featuremap[v1 * featurecount2 + v2] = 1
        i = 0
        indexmap = dict()
        for fk, fv in sorted(featuremap.items(), lambda x, y: cmp(x[1], y[1])):
             indexmap[fk] = i
             \#print str(fk) + '\t' + str(i)
             i += 1
        fout = open(outfilename, 'w')
        fout.write(str(i) + '\n')
34
        for k, v in generatefeatue.items():
             fout.write(str(k) + '\t' + str(indexmap[v]) + ':1\n')
        fout.close()
        fin1.close()
        fin2.close()
39
    \begin{array}{ll} \text{if} & \_\text{name}\_\_ == \text{'}\_\text{main}\_\text{'}: \end{array}
        path = 'u/'
         list\_dirs = os.walk(path)
44
         files = []
         for root, dirs, f in list_dirs:
             files += f
        print len( files )
        cnt = 0
        for i, f in enumerate(files):
             for j, g in enumerate(files):
                 if i < j:
                     cnt += 1
                     cross(path + f, path + g, f+g)
54
        print cnt
```

5. Qiang

• NNTrain.cpp

Training NNBlending Model.

```
#include "../NNBlending/floatfann.h"
#include <iostream>
#include <fstream>
#include <sstream>
#include <stdlib.h>
using namespace std;
```

```
NNTrain train.data predict.data result.csv save.net input_nodes_num learn_rate max_epoches layers_num
                  hidden_layer1_node_num ..
        int main(int argc, char* argv [])
10
       {
                 if (argc < 10)
                        cout << "Usage:" << endl;
                        cout << "----" << endl;
                        cout << argv[0] << "\_train.data\_predict.data\_result.csv\_save.net\_input\_nodes\_num\_layers\_num\_hidden\_layer\_node\_num\_layers\_num\_hidden\_layer\_nodes\_num\_layers\_num\_hidden\_layer\_nodes\_num\_layers\_num\_hidden\_layer\_nodes\_num\_layers\_num\_hidden\_layer\_nodes\_num\_layers\_num\_hidden\_layer\_nodes\_num\_layers\_num\_hidden\_layer\_nodes\_num\_layers\_num\_hidden\_layer\_nodes\_num\_layers\_num\_hidden\_layers\_num\_layers\_num\_hidden\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers\_num\_layers_num\_layers_num\_layers_num\_layers_num\_layers_num\_layers_num\_layers_num\_layers_num\_layers_num\_layers_num\_layers_num\_layers_num\_layers_num\_layers_num\_layers_num\_layers_num\_layers_num\_layers_num\_layers_num\_layers_num\_layers_num\_layers_num\_layers_num\_layers_num\_layers_num\_layers_num\_layers_num\_layers_num\_layers_num\_layers_num\_layers_num_layers_num_layers_num_layers_num_layers_num_layers_num_layers_num_layers_num_layers_num_layers_num_layers_num_layers_num_layers_num_layers_num_layers_num_layers_num_layers_num_layers_num_layers_num_layers
                                  \bot..." << endl;
                        return -1:
                }
                const unsigned int num_input = atoi(argv[5]);
                const unsigned int num_layers = atoi(argv[8]);
                const float learn_rate = atof(argv[6]);
20
                const unsigned int num_output = 1;
                unsigned int* num_nodes_layers = (unsigned int*)malloc(num_layers * sizeof(unsigned int)); //
                const float desired_error = (const float) 0.001;
                const unsigned int max_epochs = atoi(argv[7]);
                const unsigned int epochs_between_reports = 100;
25
                char* train_file = argv[1];
                char* predict_file = argv[2];
                char* result_file = argv[3];
                char* network_file = argv[4];
30
                num\_nodes\_layers[0] = num\_input;
                for (int i = 1; i < num\_layers-1; i++)
                {
                        num\_nodes\_layers[i] = atoi(argv[8+i]);
35
                num\_nodes\_layers[num\_layers-1] = 1;
                struct fann *ann = fann_create_standard_array(num_layers, num_nodes_layers);
40
                 fann_set_activation_function_hidden (ann, FANN_SIGMOID_SYMMETRIC);
                 fann_set_activation_function_output (ann, FANN_SIGMOID_SYMMETRIC);
                 fann_set_learning_rate (ann, learn_rate);
45
                 /* fann_set_bit_fail_limit (ann, 5.0);*/
                cout << "bit_fail_limit:_" << fann_get_bit_fail_limit (ann) << endl;
                cout << "training_algorithm:_" << fann_get_training_algorithm(ann) << endl;
                cout << "learning_rate:_" << fann_get_learning_rate(ann) << endl;
50
                 fann_train_on_file (ann, train_file, max_epochs, epochs_between_reports, desired_error);
                fann_type *calc_out;
                fann_type *input = (fann_type*)malloc(num_input * sizeof(fann_type));
                ifstream ifsPreFile;
55
                 ifsPreFile .open( predict_file );
                ofstream ofsRetFile;
                ofsRetFile.open( result_file );
                 float fScore = 0.0;
                string uid("");
                string bid("");
                 if (ifsPreFile.is_open())
                {
                                         ofsRetFile << "review_id,stars" << endl;
65
                        while (ifsPreFile.good())
                        {
                                 ifsPreFile >> uid;
                                ofsRetFile << uid;
70
                                ofsRetFile << ",";
                                for (int i = 0; i < num\_input; i++)
```

```
ifsPreFile >> fScore;
75
                    input[\,i\,]\,=fScore;
                calc\_out = fann\_run(ann, input);
                ofsRetFile << calc_out[0]*4.0+1.0 << endl;
            }
80
        }
        else
        {
            cout << "Fail_to_open_the_predict_file!" << endl;
            return -1:
85
        fann_save(ann, network_file);
        fann_destroy(ann);
        free (input);
90
        free (num_nodes_layers);
        return 0;
    }
 • MergeNNBlendingResult.py
    Merge NNBlending Model Result.
   \# -*- \text{ coding: utf-8 } -*-
    from time import time
    from glob import glob
    import os
   import cPickle
    import pylab as pl
    import numpy as np
    from math import sqrt
    import json
   from collections import defaultdict
11
    def outputFinalPredict(pre, outfile ):
        schema = []
        for line in file (final_predict_shcema):
            parts = line.strip().split(',')
16
            schema.append([parts[0], parts[1]])
        f = file (outfile, 'w')
        f.write('user_id, business_id, stars\n')
        for i, parts in enumerate(schema):
            parts.append(str(pre[i]))
21
            f.write(', '.join(parts) + '\n')
        f.close()
    if '_main__' == __name__:
        begin = time()
26
        final_predict_shcema = 'predict.schema'
            folder_id = open('folder_id').read()
31
            folder_id = int(folder_id)
        except:
            folder_id = 0
        folder\_id = folder\_id + 1
36
        folder_f = open('folder_id', 'w')
        folder_f .write(str(folder_id))
        folder_f . close()
        os.mkdir('%04d' % folder_id)
41
        predict_set = []
        outfiles = glob('*.csv')
```

```
print "\nEnsemble_Outfile_List_(Count:_%d)" % len(outfiles)
        for outfile in outfiles:
            print outfile
            predict = []
            for line in file (outfile):
                parts = line.strip().split(',')
                if parts [2] != 'stars':
                    predict.append(float(parts[2]))
51
            predict_set .append(predict)
        ensemble\_predicts = zip(*predict\_set)
        final_predict = []
        for ep in ensemble_predicts:
            final_predict .append(np.average(ep))
56
         final_outfile = '%04d/' % folder_id + '_NNBlending' + '.csv'
        outputFinalPredict(final_predict, final_outfile)
        print '\n\nFinal_ensemble_output_file:', final_outfile
        print '\n\nTotal_Execution_Time:_\%.3fs' \% (time() - begin)
61
```

• Ensemble.py

Using GradientBoostingRegressor, LinearRegression, RandomForestRegressor, Ridge Model to blending our output models (learning by 8 separated local set).

```
\# -*- coding: utf-8 -*-
    from time import time
   from glob import glob
    import os
    import cPickle
    import pylab as pl
    import numpy as np
   from math import sqrt
    import json
    from collections import defaultdict
    from sklearn.linear_model import LinearRegression, Ridge, LogisticRegression
    from sklearn.ensemble import RandomForestRegressor, GradientBoostingRegressor
14
    def getLocalTestData():
        if (os.path.exists(local_testing_obj)):
            target = cPickle.load(file (local_testing_obj))
19
            target = []
            for line in file (local_testing):
                js = json.loads(line)
                target.append(js['stars'])
            cPickle.dump(target, file(local_testing_obj, 'wb'))
24
        return target
    def getEnsembleTrainData():
         local_predict_files = glob(local_predict_path)
        print "\nLocal_Predict_File_List_(Count:_%d)" % len(local_predict_files)
        for v in local_predict_files:
            print v
        predict_set = []
        for f in local_predict_files:
            predict = []
34
            for line in file (f):
                parts = line.strip().split(',')
                if parts [2] != 'stars':
                    predict.append(float(parts[2]))
            predict_set .append(predict)
39
        local\_predict = zip(*predict\_set)
        return local_predict, predict_set
    def getEnsemblePredictData():
        online_predict_files = glob(online_predict_path)
44
        print "\nOnline_Predict_File_List_(Count:_%d)" % len(online_predict_files)
```

```
for v in online_predict_files :
             print v
         predict_set = []
         for f in online_predict_files:
49
             predict = []
             for line in file (f):
                 parts = line.strip().split(',')
                 if parts [2] != 'stars':
                     predict.append(float(parts[2]))
             predict_set .append(predict)
         online_predict = zip(*predict_set)
         return online_predict
     def outputFinalPredict(pre, outfile ):
         schema = []
         for line in file (final_predict_shcema):
             parts = line. strip(). split(', ')
             schema.append([parts[0], parts [1]])
         f = file (outfile, 'w')
64
         f.write('user_id, business_id, stars\n')
         for i, parts in enumerate(schema):
             parts.append(str(pre[i]))
             f.write(', '.join(parts) + '\n')
         f.close()
     if '__main__' == __name__:
         begin = time()
         final_predict_shcema = 'predict.schema'
         #Params of GBRT
         learning\_rate = 0.07
         n_{\text{-}}estimators = 55 \# 60
         max_depth = 2#2
79
         min\_samples\_split = 5#5
         params = []
         params.append(str(learning_rate))
         params.append(str(n_estimators))
         params.append(str(max_depth))
84
         params.append(str(min_samples_split))
             folder_id = open('folder_id').read()
             folder_id = int(folder_id)
89
         except:
             folder_id = '0'
         folder_id = folder_id + 1
         folder_f = open('folder_id', 'w')
         folder_f .write(str(folder_id))
         folder_f . close ()
         os.mkdir('%04d' % folder_id)
         # 0 for gbrt, 1 for lr, 2 for RandomForestRegressor, 3 for Ridge
99
         # blending_choise = raw_input('0 for gbrt, 1 for lr, 2 for RandomForestRegressor, 3 for Ridge\n:')
         blending\_choise = 0
         blending\_choise = int(blending\_choise)
         for GROUP in range(1, 8):
104
             print '\n' + '='*20 + '__GROUP_%d__'% GROUP + '='*20,
             local_testing = '...\ Data\ local_final_test_set_review_ %01d.json' % GROUP
             local_testing_obj = '.\Local\%02d\local_testing_%02d' % (GROUP, GROUP)
             local_predict_path = '.\Local\%02d\*local*.csv' % GROUP
109
             online\_predict\_path = '.\Online\*.csv'
             target = getLocalTestData()
             local_predict , unzip_predict = getEnsembleTrainData()
```

```
online\_predict = getEnsemblePredictData()
114
             print '\nReading_data_done_in_%.3fs' % (time() - begin)
             t = time()
             if 0 == blending\_choise:
119
                 gbrt = GradientBoostingRegressor(learning_rate=learning_rate, n_estimators=n_estimators, max_depth=max_depth,
                       min_samples_split=min_samples_split)
                 gbrt. fit (local_predict, target)
                 print '\nGBRT_regression_done_in_%.3fs' % (time() - t)
                 t = time()
                 blending_paras = 'GBRT:\n'
124
                 blending_paras += '\tScore:' + str(gbrt.score( local_predict , target))
                 blending_paras += '\n'
                 blending_paras += '\tparams:' + str(gbrt.get_params())
                 blending\_paras += '\n'
                 ensemble_predict = gbrt.predict(online_predict)
129
                 blending\_method = 'GBRT'
             elif 1 == blending_choise:
                 linr = LinearRegression()
                 linr . fit (local_predict , target)
                 print '\nLinear_regression_done_in_\%.3fs' \% (time() - t)
134
                 t = time()
                 blending_paras = 'LinearRegression:\n'
                 blending_paras += '\tScore:' + str(linr.score(local_predict, target))
                 blending_paras += '\n'
                 blending_paras += '\tcoef_:' + str(linr.coef_)
139
                 blending_paras += '\n'
                 ensemble_predict = linr.predict(online_predict)
                 blending_method = 'LinearRegression'
             elif 2 == blending\_choise:
                 rf = RandomForestRegressor()
144
                 rf. fit (local_predict, target)
                 print '\nRandom_forest_regression_done_in_%.3fs' % (time() - t)
                 t = time()
                 blending_paras = 'RandomForestRegressor:\n'
                 blending_paras += '\tScore:' + str(rf.score(local_predict, target))
149
                 blending_paras += '\n'
                 ensemble\_predict = rf.predict(online\_predict)
                 blending_method = 'RandomForestRegressor'
             elif 3 == blending_choise:
                 ridgr = Ridge(alpha=0.1)
154
                 ridgr. fit (local_predict, target)
                 print '\nRidge_regression_done_in_\%.3fs' \% (time() - t)
                 t = time()
                 blending\_paras = 'Ridge(alpha=0.1): \n'
                 blending_paras += '\tScore:' + str(ridgr.score(local_predict, target))
159
                 blending_paras += '\n'
                 blending_paras += '\tcoef_:' + str(ridgr.coef_)
                 blending_paras += '\n'
                 ensemble_predict = ridgr.predict(online_predict)
                 blending\_method = 'Ridge'
164
             outfile = '%04d/' % folder_id + '%02d_' % GROUP + '_EnsemblePredict_' + '_'.join(params) + '.csv'
             outputFinalPredict(ensemble_predict, outfile)
             print '\nPredicting_done_in_\%.3fs' \% (time() - t)
             print '\nEnsemble_output_file:', outfile
169
             t = time()
         predict_set = []
         outfiles = glob('%04d/*.csv' % folder_id)
         print "\nEnsemble_Outfile_List_(Count:_%d)" % len(outfiles)
174
         for outfile in outfiles:
             print outfile
             predict = []
             for line in file (outfile):
                 parts = line.strip().split(',')
179
                 if parts [2] != 'stars':
```

```
predict.append(float(parts[2]))
             predict_set .append(predict)
         ensemble\_predicts = zip(*predict\_set)
         final_predict = []
184
         for ep in ensemble_predicts:
             final_predict .append(np.average(ep))
          final_outfile = '%04d/' % folder_id + '_FINAL_' + '_'.join(params) + '.csv'
         outputFinalPredict(final_predict, final_outfile)
         print '\n\nFinal_ensemble_output_file:', final_outfile
189
         print '\nFinal_ensemble_done_in_%.3fs' % (time() - t)
         print '\n\nTotal_Execution_Time:_\%.3fs' \% (time() - begin)
194
  • BusinessNameAnalysis.py
     Generate BusinessNameAnalysis feature.
     \# -*- coding: cp936 -*-
     import re
     from time import time
     import json
    business\_name = \{\}
     business_name\_src = \{\}
     bid_map = \{\}
     attribte\_words = [',']
    def normalizeBusinessName(name_src):
         words = re.split (" | , | & | -|'| / | # | . ", name\_src )
         for word in words:
             if 1 == len(word):
                 if not word.isupper():
                     words.remove(word)
             elif 'co' == word.lower():
                 words.remove(word)
             elif word. isdigit ():
                 words.remove(word)
             else:
21
                 new\_word = word.strip()
                 new_word = new_word.rstrip('s')
                 words[words.index(word)] = new\_word
         if '_' in words:
             words.remove('_')
26
         if ',' in words:
             words.remove(")
         if '\t' in words:
             words.remove('\t')
         norm\_name = '\_'.join(words).lower()
31
         return norm_name
     def GetBusinessIdMap():
         tb = time()
         print 'Begin_loading_the_item_id_map_data'
         content = open('./itemmap.final').read()
         lines = content. split ('\n')
         for line in lines:
             if not line:
                 continue
41
             parts = line. split ('\t')
             bid_map[parts[0]] = parts[1]
         print 'Finish_loadint_the_item_id_map_data_in_', time() - tb, '_s'
    def GetBusinessNamesFromFile(filename):
         for line in file (filename):
             js = json.loads(line)
             bname = js['name']
             bid = js['business_id']
```

```
bname = bname.replace(u'\xe9', u'xe9')
51
            bname = bname.replace(u' \times e0', u' \times e0')
            bname = bname.replace(u'\xea', u'xea')
            bname = bname.replace(u' \times f1', u' \times f1')
            bname = bname.replace(u' \setminus xfc', u'xfc')
            bname = bname.replace(u'\xeb', u'xeb')
56
            business_name\_src[bid] = bname
            bname = normalizeBusinessName(bname)
            if bname in business_name:
                business_name[bname].append(bid)
            else:
61
                business\_name[bname] = [bid]
    def GetBusinessNames():
        tb = time()
        print 'Begin_loading_and_nomalize_the_business_name'
        GetBusinessNamesFromFile('./yelp_training_set/yelp_training_set_business.json')
        GetBusinessNamesFromFile('./final_test_set/ final_test_set_business .json')
        print 'Got_and_nomalize_the_business_name_in_', time() - tb
   def SaveNormalizedBusinessName():
        print 'Save_nomalized_business_name'
        bnames = business\_name.keys()
        print 'business_name_count_after_nomalize:_', len(bnames)
        bnames.sort()
        featureFile = open('./test/Qiang_%d_BusinessName_Normalized_Multi.txt' % len(bnames), 'w')
76
        featureFile .write('%d\n' % len(bnames))
        for bname in bnames:
            name_list = business_name[bname]
            weight = 1.0/\text{float}(\text{len}(\text{name\_list}))
            for bid in name_list:
81
                featureFile .write('%s' % bid_map[bid])
                for bid in name_list:
                     featureFile .write('\t%s:%f' % (bid_map[bid], weight))
                featureFile.write('\n')
        featureFile.close()
        print 'Save_success!
    if __name__ == '__main__':
        GetBusinessIdMap()
        GetBusinessNames()
91
        SaveNormalizedBusinessName()
 • BusinessNameWordAnalysis.py
    Generate BusinessNameWordAnalysis feature.
    \# -*- \text{ coding: cp936 } -*-
    import re
   from time import time
    import json
    business\_name = \{\}
    business_name\_src = \{\}
   bid_map = \{\}
    attribte\_words = ['']
    bname\_dict = []
    def normalizeBusinessName(name_src):
        words = re.split (" | , | & | -|'| / | # | . ", name\_src )
13
        for word in words:
            if 1 == len(word):
                if not word.isupper():
                    words.remove(word)
            elif 'co' == word.lower():
18
                words.remove(word)
            elif word. isdigit ():
                words.remove(word)
            else:
```

```
new\_word = word.strip()
23
                new_word = new_word.rstrip('s')
                words[words.index(word)] = new\_word
        if '_' in words:
            words.remove('_')
        if '' in words:
28
            words.remove(")
        if '\t' in words:
            words.remove('\t')
        for word in words:
33
            if word.lower() not in bname_dict:
                bname_dict.append(word.lower())
        norm\_name = '\_'.join(words).lower()
        return norm_name
    def GetBusinessIdMap():
        tb = time()
        print 'Begin_loading_the_item_id_map_data'
        content = open('./itemmap.final').read()
        lines = content.split ('\n')
43
        for line in lines:
            if not line:
                continue
            parts = line. split ('\t')
            bid_map[parts[0]] = parts[1]
48
        print 'Finish_loadint_the_item_id_map_data_in_', time() - tb, '_s'
    def GetBusinessNamesFromFile(filename):
        for line in file (filename):
            js = json.loads(line)
53
            bname = js['name']
            bid = js['business_id']
            bname = bname.replace(u'\xe9', u'xe9')
            bname = bname.replace(u'\xe0',\,u'xe0')
            bname = bname.replace(u'\xea', u'xea')
            bname = bname.replace(u' \setminus xf1', u'xf1')
            bname = bname.replace(u' \setminus xfc', u'xfc')
            bname = bname.replace(u'\xeb', u'xeb')
            business\_name\_src[bid] = bname
            bname = normalizeBusinessName(bname)
63
            if bname in business_name:
                business_name[bname].append(bid)
            else:
                business\_name[bname] = [bid]
68
    def GetBusinessNames():
        tb = time()
        print 'Begin_loading_and_nomalize_the_business_name'
        GetBusinessNamesFromFile('./yelp_training_set/yelp_training_set_business.json')
        GetBusinessNamesFromFile('./final_test_set/ final_test_set_business .json')
73
        print 'Got_and_nomalize_the_business_name_in_', time() - tb
    def SaveNormalizedBusinessName():
        print 'Save_nomalized_business_name'
        bnames = business_name.keys()
        print 'business_name_count_after_nomalize:_', len(bnames)
        bnames.sort()
        featureFile = open('./test/Qiang_%d_BusinessName_WordIndex.txt' % len(bnames), 'w')
        featureFile.write('%d\n' % len(bnames))
        for bname in bnames:
83
            bname\_word\_id = []
            for word in bname.split('_'):
                index = bname\_dict.index(word)
                index = str(index)
                if index not in bname_word_id:
88
                    bname_word_id.append(index)
            for bid in business_name[bname]:
```

```
featureFile .write('%s\t%s:1\n' % (bid_map[bid], ':1\t'.join(bname_word_id)))
         featureFile.close()
         print 'Save_success!'
    if __name__ == '__main__':
         GetBusinessIdMap()
         GetBusinessNames()
         SaveNormalizedBusinessName()
98
  \bullet \ \ Business Street Cluste.py
    Generate BusinessStreetCluste feature.
    \# -*- coding: cp936 -*-
    import json
    import math
    import re
    business_info = \{\}
    address\_info = \{\}
     addr\_detail\_info \ = \ []
     cluster\_info = \{\}
    def GetBusinessAddress():
         print 'Get_business_address_begin...'
         for line in open('./ yelp_training_set / yelp_training_set_business .json'):
             js = json.loads(line)
             bid = js['business_id']
             add = js['full_address']
17
             \# add = add.replace('\n', '')
             business_info[bid] = [add]
             if add not in address_info:
                  address\_info[add] = [bid]
             else:
                  address_info [add].append(bid)
         for line in open('./ yelp_test_set / yelp_test_set_business .json'):
             js = json.loads(line)
             bid = js['business\_id']
27
             add = js['full_address']
             business\_info[bid] = [add]
             if add not in address_info:
                  address\_info[add] = [bid]
32
                  address_info [add].append(bid)
         print 'Got_it!_Business_count:_%d,_address_count:_%d' % (len(business_info), len(address_info))
    def ClusteBusinessAddress(threshold):
         Cluster
         @shreshold: the similarity threshold, between 0.0-1.0
         print 'Cluster_begin ... '
         #TODO: Cluster
         for one in address_info:
             addr = [one, address_info [one]]
             \mathrm{detail} \ = \mathrm{re.\, split} \ (\, {}^{\backprime} \backslash n \, | , | \, {}^{\backprime} \backslash \, , \ \mathrm{one})
             addr.append(detail)
47
             addr.append(-1)
             addr_detail_info .append(addr)
         cnt = len(addr_detail_info)
         f = open('./test/cluster.txt', 'w')
         cluster\_cnt = 0
52
         for i in range(0, cnt):
             addr1 = addr\_detail\_info[\,i\,]
             if addr1[len(addr1)-1] > -1:
                 continue
```

```
addr1 = addr1[len(addr1)-2]
57
             cluster\_cnt += 1
             f.write('\n----\n')
             f.write(str(addr_detail_info[i]) + '\n')
              addr_{detail_info}[i][len(addr_{detail_info}[i])-1] = cluster_{cnt}
              cluster_info [ cluster_cnt ] = addr_detail_info [ i ][0]
62
             for j in range(i+1, cnt):
                 addr2 = addr_detail_info[j]
                  if addr2[len(addr2)-1] > -1:
                     continue
                 addr2 = addr2[len(addr2)-2]
67
                 sim = AddressSimilarity(addr1, addr2)
                  if sim > threshold:
                      addr_{detail_{info}}[j][len(addr_{detail_{info}}[j])-1] = cluster_{cnt}
                      f.write(str(addr_detail_info[j]) + '\n')
         f.close()
         print 'Cluster_finish!_Cluster_count:_%d' % (cluster_cnt)
     def AddressSimilarity(addr1, addr2):
         same\_cnt = 0
         for one in addr1:
77
             if one in addr2:
                 same\_cnt += 1
         return float ((2*same\_cnt))/float((len(addr1) + len(addr2)))
    def GenerateClusterFeature():
         print 'Generate_cluster_feature_begin ... '
         featureFile = open('./test/ cluster_result .txt', 'w')
         featureFile.write(str(len(cluster_info)) + '\n')
         for one in addr_detail_info:
              cluster_id = one[len(one)-1]
87
             for id in one [1]:
                 try:
                     \operatorname{src\_addr} = \operatorname{one}[0].\operatorname{replace}(' \ ', ' \ ')
                     src_addr = src_addr.replace(u'\xed', '\\xed') # fix the bug: '\x' is not asicii code
                     cluster_addr = cluster_info [ cluster_id ]. replace('\n', '\\n')
                     cluster\_addr = cluster\_addr.replace(u'\xed', '\xed')
                      featureFile .write(id + '\t' + str(cluster_id) + '\t" + src_addr + ""\t" + cluster_addr + ""\n')
                 except Exception, e:
                      print e
                      print one
97
         featureFile.close()
         print 'Generate_cluster_feature_finish!'
     if __name__ == '__main__':
         GetBusinessAddress()
102
         ClusteBusinessAddress(0.5)
         GenerateClusterFeature()
  • CategoryAnalysis.py
     Generate Category Analysis feature.
 1 import json
     category\_rating = \{\}
     review\_rating = \{\}
     # import reveiw rating data
     for line in file ('./ yelp_training_set / yelp_training_set_review .json'):
         js = json.loads(line)
         bid = js['business_id']
         rate = js['stars']
         if bid in review_rating:
11
             review_rating[bid]. append(rate)
         else:
             review\_rating[bid] = [rate]
```

```
# import category data
    for line in file ('./ yelp_training_set / yelp_training_set_business .json'):
        js = json.loads(line)
        cates = js['categories']
        bid = js['business_id']
21
        rate = review_rating[bid]
        for cate in cates:
             if cate in category_rating:
                 category\_rating[\,cate\,] \ += \, rate
             else:
                 category\_rating[cate] = rate
    print 'category_count:', len(category_rating)
    # save the analysis
    import numpy as np
    cates = category_rating.keys()
    cates\_sort\_by\_std = \{\}
    stds = []
   cates.sort()
    fout = open('./test/CategroyRateAnalysis.txt', 'w')
    fout.write(\ 'category\_count: \_\%d \ '\% \ len(cates))
    for cate in cates:
        rates = category_rating[cate]
        avg = np.average(rates)
41
        std = np.std(rates)
        if std in cates_sort_by_std:
             cates_sort_by_std [std].append(cate)
        else:
             cates\_sort\_by\_std[std] = [cate]
46
            stds.append(std)
        rates.sort()
        fout.write('-' * 15 + cate + '-' * 15 + '\setminus n')
        fout.write('rate_count:_%d\n' % len(rates))
        fout.write('average_rate: _%f\n' % avg)
        fout.write('rate_std:\sqrt[8]{n}' % std)
        fout.write(str(rates) + ^{\prime}\n')
    fout.close()
   stds.sort()
    fout = open('./test/CategorySortedByStd.txt', 'w')
    for std in stds:
        for cate in cates_sort_by_std [std]:
             fout.write('-'*15 + cate + '-'*15 + '\n')
            fout.write('std:_%f\n' % std)
61
            rates = category_rating[cate]
            for i in range(1,6):
                 fout.write('%d_stars_count:_%d\n' % (i, rates.count(i)))
    fout.close()
 • Category WordIndex.py
    Generate CategoryWordIndex feature.
    import json
    import re
    import GetIdMap
   category\_words = []
    def GetCategoryWord(category):
        words = []
        for cat in category:
            \operatorname{src\_words} = \operatorname{re.split}(' \_ | \& |, ', \operatorname{cat})
             for one in src_words:
10
                 if not one:
                     continue
                 if one [0] == '(':
                     continue
                 new\_word = one
```

```
if one.endswith('ies'):
                    new\_word = one[:-3] + 'y'
                elif one.endswith('s'):
                    new\_word = one[:-1]
                new\_word = new\_word.lower()
20
                if new_word not in words:
                    words.append(new_word)
                if new_word not in category_words:
                    category_words.append(new_word)
        return words
    business\_cat = \{\}
    for line in file ('./ yelp_training_set / yelp_training_set_business .json'):
        js = json.loads(line)
        bid = js['business_id']
30
        category = js['categories']
        business_cat [bid] = GetCategoryWord(category)
    for line in file ('./ final_test_set / final_test_set_business .json'):
        js = json.loads(line)
        bid = js['business_id']
35
        category = js['categories']
        business_cat [bid] = GetCategoryWord(category)
    word\_cnt = len(category\_words)
   word\_cnt += 1
    categoryFile = open('./test/Qiang_%d_Business_CategoryWordIndex.csv' % word_cnt, 'w')
    categoryFile.write('%d\n' % word_cnt)
    id_map = GetIdMap.GetItemMap()
    for bid in business_cat:
        categoryFile.write('%s\t' % id_map[bid])
45
        for word in business_cat [bid]:
            categoryFile.write('\t%d:1' % category_words.index(word))
        if 0 == len(business\_cat[bid]):
            categoryFile.write('\t%d:1' % (word_cnt-1))
        categoryFile.write('\n')
    categoryFile.close()
 • CategroySelectionFeature.py
    Generate CategroySelectionFeature feature.
    import json
    bid\_cates = \{\}
   cate\_var = \{\}
    # import the data
    for line in file ('./test/CateVar.txt'):
        parts = line. strip(). split('\t')
        if len(parts) < 4:
            continue
        cate = parts[0]
        var = float(parts[3])
        cate\_var[cate] = var
    import GetIdMap
    id_map = GetIdMap.GetItemMap()
    useful\_cates = []
   threshold = 1.6500
    for line in file ('./ yelp_training_set / yelp_training_set_business .json'):
        js = json.loads(line)
        bid = js['business\_id']
        cates = js['categories']
24
        bid_map = id_map[bid]
        clean_cate = []
        for cate in cates:
            if cate_var[cate] < threshold:
```

```
clean_cate.append(cate)
29
                if cate not in useful_cates:
                     useful_cates .append(cate)
        if len(clean\_cate) > 0:
            bid\_cates[bid\_map] = clean\_cate
34
    fFile = open('./test/Qiang_%d_CategoryVarUnder%.04f_.txt' % (len(useful_cates), threshold), 'w')
    fFile .write('%d\n' % len(useful_cates))
    for bid in bid_cates:
        fFile.write('%s' % bid)
        for cate in bid_cates[bid]:
39
            fFile.write('\t%d:1' % useful_cates.index(cate))
        fFile .write('\n')
    fFile.close()
 • CheckInAnalysis.py
    Generate CheckInAnalysis feature.
    import json
    bid\_checkin\_info = \{\}
    for line in file ('./ yelp_training_set / yelp_training_set_checkin .json'):
        js = json.loads(line)
        checkin\_info\ = js[\,'checkin\_info\,']
        bid = js['business_id']
        if bid not in bid_checkin_info:
            bid\_checkin\_info[bid] = [0]*4
        for key in checkin_info.keys():
            cnt = checkin\_info[key]
            hour = int(key. split(',-')[0])
13
            bid\_checkin\_info[bid][hour/6] += cnt
    for line in file ('./ final_test_set / final_test_set_checkin .json'):
        js = json.loads(line)
        checkin_info = js['checkin_info']
18
        bid = js['business_id']
        if bid not in bid_checkin_info:
            bid_checkin_info[bid] = [0]*4
        for key in checkin_info.keys():
            cnt = checkin\_info[key]
23
            hour = int(key. split(',-')[0])
            bid\_checkin\_info [bid][hour/6] += cnt
    import GetReviewIdMap
   import numpy as np
    id_map = GetReviewIdMap.GetIdPairByRid()
    user\_checkin\_info = \{\}
    for rid in id_map:
        uid, bid = id_{map}[rid]
        if bid not in bid_checkin_info:
33
            continue
        if uid not in user_checkin_info:
            user_checkin_info [uid] = np.array(bid_checkin_info [bid])
        else:
            user_checkin_info [uid] += np.array(bid_checkin_info[bid])
38
    ucheckFile = open('./test/UserReviewBusinessCheckInTime.txt', 'w')
    mostCheckInTime = []
    for uid in user_checkin_info:
        ucheckFile.write('-' * 30 + '\n' + uid + '\n')
        for cnt in user_checkin_info [uid]:
            ucheckFile.write('%d_' % cnt)
        mostCheckIn = user\_checkin\_info[uid].max()
        index = user_checkin_info [uid]. tolist ().index(mostCheckIn)
        if index not in mostCheckInTime:
48
            mostCheckInTime.append(index)
        ucheckFile.write('\n')
```

```
ucheckFile.close()
53
    import GetIdMap
    uid_map = GetIdMap.GetUserMap()
    f_cnt = len(mostCheckInTime)
    mostCheckInFeature = open('./test/Qiang\_\%d\_UserCheckInMost\_4\_TimeBin.txt'~\%~f\_cnt,~'w')
   mostCheckInFeature.write('%d\n' % f_cnt)
    for uid in user_checkin_info:
        mostCheckIn = user\_checkin\_info[uid].max()
        index = user_checkin_info[uid]. tolist ().index(mostCheckIn)
        mostCheckInFeature.write('%s\t%d:1\n' % (uid_map[uid], index))
63
    mostCheckInFeature.close()
 • CoordinateCluster.py
    Generate CoordinateCluster feature.
   import time as time
    import numpy as np
    import pylab as pl
    import mpl_toolkits.mplot3d.axes3d as p3
    from sklearn. cluster import Ward
   from sklearn.datasets.samples_generator import make_swiss_roll
    import json
    def GetItemIdMap():
        bid_map = \{\}
        for line in open('./itemmap.final'):
11
            parts = line. split ('\t')
            bid_map[parts[0]] = int(parts[1])
        return bid_map
    def GetCoordinateData():
        print 'Get_business_coordinate_begin...'
        tb = time.time()
        coordinates = []
        business = \{\}
21
        bid_map = GetItemIdMap()
        for line in open('./ yelp_training_set / yelp_training_set_business .json'):
            js = json.loads(line)
            bid = js['business_id']
            lon = float (js ['longitude'])
26
            lat = float(js['latitude'])
            coordinates.append([lon, lat])
            id = \%f_{-}\%f' \% (lon, lat)
            if id in business:
31
                business [id]. append(bid_map[bid])
            else:
                business[id] = [bid\_map[bid]]
        for line in open('./ final_test_set / final_test_set_business .json'):
            js = json.loads(line)
            bid = js['business_id']
            lon = float(js['longitude'])
            lat = float(js['latitude'])
            coordinates.append([lon, lat])
            id = \%f_{-}\%f' \% (lon, lat)
41
            if id in business:
                business [id]. append(bid_map[bid])
            else:
                business[id] = [bid\_map[bid]]
46
        print 'Loading_data_done_in_%s_seconds' % str(time.time()-tb)
        return coordinates, business
```

```
51
       # Generate data (swiss roll dataset)
   coordinates, business = GetCoordinateData()
       # Compute clustering
   choise = 0
   clusters_num = 50
   if 0 == \text{choise}:
      print("Compute_unstructured_hierarchical_clustering...")
      st = time.time()
61
      ward = Ward(n\_clusters=clusters\_num).fit(coordinates)
      label = ward.labels_{-}
      print ("Cluster_done!_Elapsed_time:_", time.time() - st)
      print("Number_of_points:_", label.size)
   elif 1 == choise:
66
   # Define the structure A of the data. Here a 10 nearest neighbors
      from sklearn.neighbors import kneighbors_graph
      connectivity = kneighbors_graph(coordinates, n_neighbors=10)
71
      print("Compute_structured_hierarchical_clustering...")
      st = time.time()
      ward = Ward(n\_clusters\_clusters\_num, connectivity = connectivity).fit(coordinates)
      label = ward.labels_{-}
      print("Elapsed\_time:\_", time.time() - st)
76
      print("Number_of_points:_", label.size)
   #
       # Generate result
   lid = 0
   cFile = open('./test/Qiang_%d_Coordinate_HierarCluster_%d.txt' % (clusters_num, choise), 'w')
   cFile.write('%d\n' % clusters_num)
   for point in coordinates:
      pid = \%f_{-}\%f' \% (point[0], point[1])
      for bid in business[pid]:
          cFile.write('%d\t%d:1\n' % (bid, label[lid]))
      lid += 1
   cFile.close()
   print 'Finish_all!_Elapsed_time:_', time.time() - st
 • CoordinatesAnalyse.py
   Generate Coordinates Analyse feature.
   \# -*- \text{ coding: cp936 } -*-
   import json
   import math
   import re
   coordinate = \{\}
   lons = []
   def GetCoordinates():
      print 'Get_business_coordinate_begin...'
      for line in open('./ yelp_training_set / yelp_training_set_business .json'):
          js = json.loads(line)
          bid = js['business_id']
14
          lon = float(js['longitude'])
          lat = float(js['latitude'])
          if lon in coordinate:
             coordinate[lon].append({lat:bid})
```

```
else:
19
                coordinate[lon] = [\{lat:bid\}]
                lons.append(lon)
        for line in open('./ yelp_test_set / yelp_test_set_business .json'):
24
            js = json.loads(line)
            bid = js['business_id']
            lon = float(js['longitude'])
            lat = float(js['latitude'])
            if lon in coordinate:
29
                coordinate[lon].append({lat:bid})
            else:
                coordinate[lon] = [\{lat:bid\}]
                lons.append(lon)
    def SaveOrderedCoordinates():
        sFile = open('coordinate_sort.txt', 'w')
        lons.sort()
        for lon in lons:
39
            coordinate[lon].sort()
            for pair in coordinate[lon]:
                sFile.write(\%.66\t\%.6f\t\%s\n'\% (lon, pair.keys() [0], pair.values() [0])
            sFile.write('\n')
        sFile.close()
44
    if __name__ == '__main__':
       GetCoordinates()
        SaveOrderedCoordinates()
 • Generate UserRegisterDate.py
    Generate Generate User Register Date feature.
    import os
   import time
    import numpy
    import json
    import math
    from scipy. cluster .vq import vq, kmeans, whiten,kmeans2
   import matplotlib.pyplot as plt
    import random
    UserCount = 55965
    ItemCount = 14334
12
    user\_time={}
    item\_time={}
    ui\_time={}
17
    user_f = \{\}
    item_f = \{\}
    maxtime=0
   mintime=1e15
    for line in open('./ yelp_training_set / yelp_training_set_review .json'):
        js = json.loads(line)
        uid = js['user\_id']
        bid = js['business_id']
        timestamp = math.log(time.mktime(time.strptime(js['date'],'%Y-%m-%d')),2)
        if maxtime<timestamp:
            maxtime=timestamp
        if mintime>timestamp:
32
            mintime=timestamp
```

```
ui_time [(uid,bid)]=timestamp
        if uid in user_time:
            user_time[uid].append(timestamp)
            user_time[uid]=[timestamp]
        if bid in item_time:
           item_time[bid].append(timestamp)
42
        else:
            item_time[bid]=[timestamp]
    print 'Read_Data_Over!'
47
    for line in open('./ final_test_set / final_test_set_review .json'):
        js = json.loads(line)
        uid = js['user\_id']
        bid = js['business_id']
52
        if bid in item_time:
            ui_time[(uid,bid)]=min(item_time[bid])
        elif uid in user_time:
            ui_time[(uid,bid)]=min(user_time[uid])
        else:
            ui_time [(uid,bid)]=random.random()*(maxtime-mintime)+mintime
    print len(ui_time)
    # generate feature
    from GetIdMap import GetUserMap
    user_map = GetUserMap()
    size = 100
   fout = open('./test/Qiang_%d_UserFirstReviewTimeBin.txt' % (size + 1),'w')
    fout.write('%d\n'%(size+1))
    for uid in user_map:
        if uid in user_time:
            u_{time} = min(user_{time}[uid])
            cid = int(float(u_time-mintime-1e-8)/(maxtime-mintime)*size)
72
            fout.write('%s\t%d:1\n' % (user_map[uid], cid))
            fout.write('%s\t%d:1\n' % (user_map[uid], size))
    fout.close()
    exit(0)
 • Generate Weekday Or Weekend Day Checkin.py
    Generate Generate Weekday Or Weekend Day Checkin feature.
    import json
    from GetIdMap import GetItemMap
    def GetCheckInInfo(checkin_file):
        for line in file ( checkin_file ):
            js = json.loads(line)
            bid = js['business\_id']
            check_in = js['checkin_info']
            weekend\_cnt = 0
            weekday\_cnt = 0
            for keys in check_in.keys():
                parts = keys.split('-')
                if 1 < int(parts[1]):
13
                    weekday\_cnt += check\_in[keys]
                else:
                    weekend\_cnt += check\_in[keys]
            check_in_info [bid] = 1 if weekday_cnt > weekend_cnt else 0
18
    check_in_info = \{\}
    item_map = GetItemMap()
    GetCheckInInfo('./yelp_training_set/yelp_training_set_checkin.json')
```

```
GetCheckInInfo('./ final_test_set / final_test_set_checkin .json')
23
         fFile = open('./test/Qiang_3_CheckInWeekdayOrWeekendDay.txt', 'w')
         fFile .write('3\n')
         for bid in item_map:
                  if bid in check_in_info:
                           fFile.write('%s\t%d:1\n' % (item_map[bid], check_in_info[bid]))
28
                           fFile.write('%s\t2:1\n' % item_map[bid])
         fFile.close()
         fFile = open('./test/Qiang_2_HaveCheckInOrNot.txt', 'w')
         fFile .write('2\n')
         for bid in item_map:
                  if bid in check_in_info:
                           fFile.write('%s\t1:1\n' % (item_map[bid]))
38
                           fFile .write('%s\t0:1\n' % item_map[bid])
         fFile.close()
   • Street.py
         Generate Street feature.
         \# -*- \text{coding: cp936} -*-
         import json
         import math
       import re
         business_info = \{\}
         address\_info = \{\}
         addr_detail_info = []
         cluster\_info = \{\}
         item\_map = \{\}
         streetFlags = ['rd', 'road', 'ave', 'av', 'avenue', 'blvd', 'boulevard', 'pkwy', 'parkway', 'dr', 'drive', 'st', 'street', 'pkwy', 'parkway', 'dr', 'drive', 'st', 'st
        'ave' : ['ave', 'av', 'avenue'],
                                        'blvd' : ['blvd', 'boulevard'],
15
                                        'pkwy' : ['pkwy', 'parkway'],
                                        'dr' : ['dr', 'drive'],
                                        'st': ['st', 'street'],
                                        'way': ['way'],
                                        'fwy': ['fwy', 'freeway'],
20
                                        'ln' : ['ln', 'la', 'lane'],
                                        'ct' : ['ct', 'cour'],
                                        'sq' : ['sq', 'square'],
                                        'cir' : ['cir', 'circle']}
         def CleanStreet(street):
                  if '#' in street:
                           street = street [: street .index('#')]
                 addrs = re. split (r' | | | | | , ', street)
                           int (addrs [0])
                          addrs.remove(addrs[0])
                 except:
                          print 'No_street_number'
35
                  if 'n' in addrs:
                          addrs.remove('n')
                   elif 's' in addrs:
                          addrs.remove('s')
                   elif 'e' in addrs:
40
                          addrs.remove('e')
                   elif 'w' in addrs:
                          addrs.remove('w')
                   elif 'north' in addrs:
```

```
addrs.remove('north')
45
         elif 'south' in addrs:
             addrs.remove('south')
         elif 'east' in addrs:
             addrs.remove('east')
         elif 'west' in addrs:
50
             addrs.remove('west')
         elif 'nw' in addrs:
             addrs.remove('nw')
         elif 'nw' in addrs:
             addrs.remove('nw')
55
         if '' in addrs:
             addrs.remove(")
         if '_' in addrs:
             \operatorname{addrs.remove}(' \_')
60
         newAddr = []
         for addr in addrs:
             if addr.lower() in streetFlags:
                 newAddr.append(addr)
                 break
65
             newAddr.append(addr)
         addrs = newAddr
         for addr in streetAddr:
             if addrs[len(addrs)-1].lower() in streetAddr[addr]:
70
                 addrs[len(addrs)-1] = addr
         return '_'. join (addrs)
     def GetStreetInfo(full_address):
         full\_address = full\_address.replace(u'\xed', u'xed')
         full\_address = full\_address.lower()
         addrs = full\_address.split('\n')
         pat = r'\d+?\s+?[nswe]\{1,2\}\.\{0,1\}\..+?'
         for addr in addrs:
             tmp = addr.replace('south', 's')
             tmp = tmp.replace('north', 'n')
             tmp = tmp.replace('west', 'n')
             tmp = tmp.replace('east', 'e')
             if re.match(pat, tmp, re.S):
85
                 return CleanStreet(addr)
             words = re.split(' | \ \ \ \ \ \ )
             if words[len(words)-1].lower() in streetFlags:
                 return CleanStreet(addr)
             for word in words:
90
                  if word.lower() in streetFlags:
                     return CleanStreet(addr)
         {\rm return} \ ,,
     def GetBusinessAddress():
         print 'Get_business_address_begin...'
         streetFile = open('./test/ streets_precise .txt', 'w')
         for line in open('./ yelp_training_set / yelp_training_set_business .json'):
             js = json.loads(line)
100
             bid = js['business_id']
             add = js['full_address']
             add = add.replace(u'\xed', u'xed')
             business_info [bid] = add.replace('\n', '\n')
             \# add = add.replace('\n',
105
             street = GetStreetInfo(add)
             if street not in address_info:
                  address\_info[street] = [bid]
                  address_info [street].append(bid)
110
             streetFile.write(bid + '\t' + street + '\n')
```

```
for line in open('./ final_test_set / final_test_set_business .json'):
             js = json.loads(line)
             bid = js['business\_id']
115
             add = js['full_address']
             add = add.replace(u' \land xed', u' xed')
             business_info [bid] = add.replace('\n', '\\n')
             street = GetStreetInfo(add)
             if street not in address_info:
120
                 address\_info[street] = [bid]
             else:
                  address_info [street].append(bid)
             streetFile.write(bid + '\t' + street + '\n')
         streetFile . close()
125
     def GetItemMap():
         for line in file ("itemmap.final"):
             if not line:
                 continue
130
             parts = line. strip(). split('\t')
             item_map[parts[0]] = parts[1]
     def SaveStreetClusterFileAndFeatureFile():
         streetCFile = open('./test/ streetClusters_precise .txt', 'w')
135
         streetMissFile = open('./test/businessMissStreet.txt', 'w')
         featureFile = open('./test/Qiang_%d_Street.txt' % len(address_info), 'w')
         featureFile.write('%d\n' % len(address_info))
         cid = 0
         for one in address_info:
140
             if ,, == one:
                 for bid in address_info [one]:
                     streetMissFile.write(bid + '\t' + business_info[bid] + '\n')
             for bid in address_info [one]:
                 streetCFile.write(bid + '\t' + str(cid) + '\t' + one + '\n')
145
                  featureFile.write('%s\t%d:1\n' % (item_map[bid], cid))
             cid += 1
         streetCFile.close()
         streetMissFile.close()
150
         print 'Got_it!'
     if __name__ == '__main__':
         GetBusinessAddress()
         GetItemMap()
         SaveStreetClusterFileAndFeatureFile()
  • StreetAnalyse.py
     Generate StreetAnalyse feature.
     \# -*- \text{ coding: cp936 } -*-
     import json
     import math
     import re
     business_info = \{\}
     address\_info = \{\}
     full\_address = \{\}
     addr_{detail_info} = []
     cluster\_info = \{\}
     def GetStreetInfo(full_address):
         full\_address = full\_address.replace(u'\xed', u'xed')
         addrs = full\_address.split('\n')
         addr = addrs[0]
         addrs = addr.split('_-')
17
```

```
int (addrs [0])
             addrs.remove(addrs[0])
        except:
             print 'No_street_number'
22
         if 'N' in addrs:
             addrs.remove('N')
         elif 'S' in addrs:
             addrs.remove('S')
         elif 'E' in addrs:
             addrs.remove('E')
         elif 'W' in addrs:
             addrs.remove('W')
        return '_'. join (addrs)
32
    def GetBusinessAddress():
        print 'Get_business_address_begin...'
         for line in open('./ yelp_training_set / yelp_training_set_business .json'):
             js = json.loads(line)
37
             bid = js['business\_id']
             add = js['full_address']
             add = add.replace(u'\xed', u'xed')
             full_address[bid] = add
42
         for line in open('./ yelp_test_set / yelp_test_set_business .json'):
             js = json.loads(line)
             bid = js['business_id']
             add = js['full_address',]
             add = add.replace(u' \setminus xed', u' xed')
47
             full_address[bid] = add
    def SaveStreetByEnter():
        sFile = \{\}
        for bid in full_address:
52
             addrs = full\_address[bid]. split('\n')
             if str(len(addrs)) not in sFile:
                 sFile [str(len(addrs))] = open('./test/StreetWith' + str(len(addrs)) + 'Enter.txt', 'w')
             sFile [str(len(addrs))]. write(bid + '\t' + '--|--' . join(addrs) + '\n')
        for one in sFile:
57
             sFile [one]. close ()
    \begin{array}{ll} \text{if} & \_\text{name}\_\_ == \text{'}\_\text{main}\_\_\text{'}: \end{array}
        GetBusinessAddress()
        SaveStreetByEnter()
62
 • StreetDirection.py
    Generate StreetDirection feature.
    \# -*- \text{ coding: cp936 } -*-
    import json
    import math
    import re
    business_info = \{\}
    address\_info = \{\}
    addr_detail_info = []
    cluster\_info = \{\}
    item\_map = \{\}
    streetFlags = ['rd', 'road', 'ave', 'av', 'avenue', 'blvd', 'boulevard', 'pkwy', 'parkway', 'dr', 'drive', 'st', 'street', '
         way', 'fwy', 'freeway', 'ln', 'la', 'lane', 'ct', 'court', 'sq', 'square', 'cir', 'circle']
    streetAddr = \{'rd' : \ ['rd', 'road'],
                    'ave' : ['ave', 'av', 'avenue'],
                    'blvd' : ['blvd', 'boulevard'],
                    'pkwy': ['pkwy', 'parkway'],
                    'dr' : ['dr', 'drive'],
                    'st' : ['st', 'street',],
                    'way': ['way'],
```

```
'fwy' : ['fwy', 'freeway'],
                   'ln' : ['ln', 'la', 'lane'],
                   'ct' : ['ct', 'cour'],
                   'sq' : ['sq', 'square'],
'cir' : ['cir', 'circle']}
23
    def CleanStreet(street):
        if '#' in street:
             street = street [: street .index('#')]
28
        addrs = re. split (r' | | | | , ', street)
             int (addrs [0])
             addrs.remove(addrs[0])
        except:
33
             print 'No_street_number'
         if 'n' in addrs:
             return 'n'
         elif 's' in addrs:
38
             return 's'
         elif 'e' in addrs:
            return 'e'
         elif 'w' in addrs:
            return 'w'
43
         elif 'north' in addrs:
            return 'n'
         elif 'south' in addrs:
            return 's'
         elif 'east' in addrs:
            return 'e'
         elif 'west' in addrs:
            return 'w'
         elif 'nw' in addrs:
            return 'nw'
53
         elif 'ne' in addrs:
            return 'ne'
         elif 'sw' in addrs:
            return 'sw'
         elif 'se' in addrs:
58
            return 'se'
        else:
            {\rm return} \ ,,
63
    def GetStreetInfo(full_address):
         full\_address = full\_address.replace(u'\xed', u'xed')
         full\_address = full\_address.lower()
        addrs = full\_address.split('\n')
        pat = r'\d+?\s+?[nswe]\{1,2\}\.\{0,1\}\..+?'
        for addr in addrs:
             tmp = addr.replace('south', 's')
             tmp = tmp.replace('north', 'n')
             tmp = tmp.replace('west', 'n')
             tmp = tmp.replace('east', 'e')
73
             if re.match(pat, tmp, re.S):
                 return CleanStreet(addr)
             words = re.split(' | .', addr)
             if words[len(words)-1].lower() in streetFlags:
                 return CleanStreet(addr)
78
             for word in words:
                 if word.lower() in streetFlags:
                     return CleanStreet(addr)
        return ',
83
    def GetBusinessAddress():
        print 'Get_business_address_begin...'
        streetFile = open('./test/ streets_precise .txt', 'w')
```

```
for line in open('./ yelp_training_set / yelp_training_set_business .json'):
             js = json.loads(line)
             bid = js['business\_id']
             add = js['full_address']
             add = add.replace(u' \times u' \times u')
             business_info [bid] = add.replace('\n', '\n')
93
             street = GetStreetInfo(add)
             if street not in address_info:
                 address\_info[street] = [bid]
             else:
98
                  address_info [street].append(bid)
              streetFile.write(bid + '\t' + street + '\n')
         for line in open('./ final_test_set / final_test_set_business .json'):
             js = json.loads(line)
103
             bid = js['business\_id']
             add = js['full\_address']
             add = add.replace(u' \setminus xed', u' xed')
             business_info [bid] = add.replace('\n', '\n')
108
             street = GetStreetInfo(add)
              if street not in address_info:
                  address\_info[street] = [bid]
                  address_info [street].append(bid)
113
              streetFile.write(bid + '\t' + street + '\n')
         streetFile.close()
     def GetItemMap():
         for line in file ("itemmap.final"):
118
              if not line:
                 continue
             parts = line. strip(). split('\t')
             item\_map[parts[0]] = parts[1]
123
     def SaveStreetClusterFileAndFeatureFile():
         featureFile = open('./test/Qiang_%d_StreetDirection.txt' % len(address_info), 'w')
         featureFile .write('%d\n' % len(address_info))
         cid = 0
         for one in address_info:
128
             for bid in address_info [one]:
                  featureFile.write('\%s\t\%d:1\n'\% (item\_map[bid], cid))
             cid += 1
         featureFile.close()
133
         print 'Got_it!'
     if __name__ == '__main__':
         GetBusinessAddress()
         GetItemMap()
         Save Street Cluster File And Feature File () \\
  • Street With Direction.py
     Generate StreetWithDirection feature.
     \# -*- \text{ coding: cp936 } -*-
    import json
     import math
     import re
     business_info = \{\}
     address\_info = \{\}
     addr_detail_info = []
     cluster\_info = \{\}
```

```
item\_map = \{\}
    streetFlags = ['rd', 'road', 'ave', 'av', 'avenue', 'blvd', 'boulevard', 'pkwy', 'parkway', 'dr', 'drive', 'st', 'street', '
         way', 'fwy', 'freeway', 'ln', 'la', 'lane', 'ct', 'court', 'sq', 'square', 'cir', 'circle']
   streetAddr = \{'rd' : \ ['rd', \ 'road'],
                   'ave' : ['ave', 'av', 'avenue'],
                   'blvd' : ['blvd', 'boulevard'],
                   'pkwy': ['pkwy', 'parkway'],
                   'dr' : ['dr', 'drive'],
                   'st' : ['st', 'street',],
                   'way' : ['way'],
                   'fwy' : ['fwy', 'freeway'],
                   'ln': ['ln', 'la', 'lane'],
                   'ct' : ['ct', 'cour'],
                   'sq' : ['sq', 'square'],
23
                   'cir': ['cir', 'circle']}
    def CleanStreet(street):
        if '#' in street:
            street = street [: street .index('#')]
28
        addrs = re. split (r' | | | | , ', street)
            int (addrs [0])
            addrs.remove(addrs[0])
33
            print 'No_street_number'
        if '' in addrs:
            addrs.remove(")
        if '_' in addrs:
            addrs.remove('_')
        newAddr = []
        for addr in addrs:
             if addr.lower() in streetFlags:
43
                newAddr.append(addr)
                break
            newAddr.append(addr)
        addrs = newAddr
48
        for addr in streetAddr:
             if addrs[len(addrs)-1].lower() in streetAddr[addr]:
                addrs[len(addrs)-1] = addr
        return '_'. join (addrs)
53
    def GetStreetInfo(full_address):
         full\_address = full\_address.replace(u'\xed', u'xed')
        full\_address = full\_address.lower()
        addrs = full\_address.split('\n')
        pat = r'\d+?\s+?[nswe]\{1,2\}\.\{0,1\}...+?'
        for addr in addrs:
            tmp = addr.replace('south', 's')
            tmp = tmp.replace('north', 'n')
            tmp = tmp.replace('west', 'n')
63
            tmp = tmp.replace('east', 'e')
            if re.match(pat, tmp, re.S):
                return CleanStreet(addr)
            words = re.split(' | \.', addr)
            if words[len(words)-1].lower() in streetFlags:
68
                return CleanStreet(addr)
            for word in words:
                 if word.lower() in streetFlags:
                    return CleanStreet(addr)
        return ''
73
```

def GetBusinessAddress():

print 'Get_business_address_begin...'

```
streetFile = open('./test/ streets_precise .txt', 'w')
78
         for line in open('./ yelp_training_set / yelp_training_set_business .json'):
             js = json.loads(line)
             bid = js['business\_id']
             add = js['full_address']
             add = add.replace(u' \setminus xed', u' xed')
83
             business_info [bid] = add.replace('\n', '\n')
             \# add = add.replace('\n',
             street = GetStreetInfo(add)
             if street not in address_info:
                 address\_info[street] = [bid]
88
                  address_info [ street ]. append(bid)
             streetFile.write(bid + '\t' + street + '\n')
         for line in open('./ final_test_set / final_test_set_business .json'):
             js = json.loads(line)
             bid = js['business\_id']
             add = js['full\_address']
             add = add.replace(u'\xed', u'xed')
             business_info [bid] = add.replace('\n', '\n')
             street = GetStreetInfo(add)
             if street not in address_info:
                 address\_info[street] = [bid]
             else:
                 address_info [ street ]. append(bid)
103
             streetFile.write(bid + '\t' + street + '\n')
         streetFile.close()
     def GetItemMap():
         for line in file ("itemmap.final"):
108
             if not line:
                 continue
             parts = line. strip(). split('\t')
             item\_map[parts[0]] = parts[1]
     def SaveStreetClusterFileAndFeatureFile():
         featureFile = open('./test/Qiang_%d_StreetWithDirection.txt' % len(address_info), 'w')
         featureFile .write('%d\n' % len(address_info))
         cid = 0
         for one in address_info:
118
             for bid in address_info [one]:
                  featureFile.write('\%s\t\%d:1\n'\% (item\_map[bid], cid))
             cid += 1
         featureFile.close()
123
         print 'Got_it!'
     if __name__ == '__main__':
         GetBusinessAddress()
         GetItemMap()
         Save Street Cluster File And Feature File () \\
  • UserBusinessName.py
     Generate UserBusinessName feature.
     import GetReviewIdMap
     import GetIdMap
     bid\_sname\_map = \{\}
     for line in file ('./test/Qiang_9998_BusinessName_Normalized.txt'):
         parts = line. strip(). split('\t')
         if len(parts) < 2:
             continue
         sname = parts[1]. split(':')[0]
```

```
bid\_sname\_map[parts[0]] = sname
   id_map = GetReviewIdMap.GetIdPairByRid()
    uid_map = GetIdMap.GetUserMap()
    bid_map = GetIdMap.GetItemMap()
    uid\_sname\_map = \{\}
   all\_sname = []
    for rid in id_map:
        uid, bid = id_map[rid]
        uid = uid\_map[uid]
        bid = bid\_map[bid]
        sname = bid_sname_map[bid]
23
        if sname not in all_sname:
            all_sname.append(sname)
        if uid in uid_sname_map:
            if sname_not in uid_sname_map[uid]:
                uid_sname_map[uid].append(sname)
28
        else:
            uid\_sname\_map[uid] = [sname]
    f_{cnt} = len(all\_sname)
    fFile = open('./test/Qiang_%d_UserBusinessName.txt' % f_cnt, 'w')
    fFile .write('%d\n' % f_cnt)
    for uid in uid_sname_map:
        fFile.write('%s\t%s' % (uid, ':1\t'.join(uid_sname_map[uid])) + ':1\n')
    fFile.close()
 • UserBusinessNameTail.py
    Generate UserBusinessNameTail feature.
    import GetReviewIdMap
   {\bf import} \,\, {\bf GetIdMap}
    import json
    bid\_city\_map = \{\}
    all\_cname = []
    for line in file ('./ yelp_training_set / yelp_training_set_business .json'):
        js = json.loads(line)
        bid = js['business_id']
        city = js['name']
        city = city.lower()
12
        city = city. split ('_{-})[-1]
        bid\_city\_map[bid] = city
        if city not in all_cname:
            all_cname.append(city)
17
    for line in file ('./ final_test_set / final_test_set_business .json'):
        js = json.loads(line)
        bid = js['business_id']
        city = js['name']
        city = city.lower()
22
        city = city. split (' \_')[-1]
        bid\_city\_map[bid] = city
        if city not in all_cname:
            all_cname.append(city)
    print len(all_cname)
    id_map = GetReviewIdMap.GetIdPairByRid()
    uid_map = GetIdMap.GetUserMap()
    bid_map = GetIdMap.GetItemMap()
32
    uid\_city\_map = \{\}
    for rid in id_map:
        uid, bid = id_map[rid]
        cname = bid\_city\_map[bid]
```

37

 $uid = uid_map[uid]$

```
bid = bid\_map[bid]
        cname = all\_cname.index(cname)
        cname = str(cname)
        if uid in uid_city_map:
            if cname not in uid_city_map[uid]:
42
                uid_city_map[uid]. append(cname)
        else:
            uid\_city\_map[uid] = [cname]
    f_{cnt} = len(all_{cname})
    fFile = open('./test/Qiang_%d_User_BusinessNameTail.txt' % f_cnt, 'w')
    fFile .write('%d\n' % f-cnt)
    for uid in uid_city_map:
        fFile.write('%s\t%s' % (uid, ':1\t'.join(uid_city_map[uid])) + ':1\n')
    fFile.close()
 • UserCategoryHistory.py
    Generate UserCategoryHistory feature.
    import json
    user_cate_his = \{\}
    item\_cates = \{\}
    useful\_cates = []
   # import data
    for line in file ('./ yelp_training_set / yelp_training_set_business .json'):
        js = json.loads(line)
        item_cates[js['business_id']] = js['categories']
   for line in file ('./ yelp_training_set / yelp_training_set_review .json'):
        js = json.loads(line)
        uid = js['user\_id']
        bid = js['business_id']
        if uid not in user_cate_his:
            user_cate_his[uid] = []
17
        for cate in item_cates[bid]:
            if cate not in user_cate_his [uid]:
                user_cate_his [uid]. append(cate)
                if cate not in useful_cates:
                     useful_cates .append(cate)
22
    import GetIdMap
    id_map = GetIdMap.GetUserMap()
    fFile = open('./test/Qiang_%d_UserCategoryHistory.txt' % len(useful_cates), 'w')
    fFile .write('%d\n' % len(useful_cates))
    for uid in user_cate_his:
        if len(user\_cate\_his[uid]) == 0:
            continue
        fFile .write(id_map[uid])
        for cate in user_cate_his [uid]:
32
            fFile .write('\t%d:1' % useful_cates.index(cate))
        fFile .write('\n')
    fFile.close()
 • UserCityFeature.py
    Generate UserCityFeature feature.
    import GetReviewIdMap
   import GetIdMap
    import json
    bid\_city\_map = \{\}
    all\_cname = []
    for line in file ('./ yelp_training_set / yelp_training_set_business .json'):
        js = json.loads(line)
        bid = js['business_id']
```

```
cite = js['city']
        cite = cite.lower()
12
        bid_city_map[bid] = cite
        if cite not in all_cname:
            all_cname.append(cite)
    for line in file ('./ final_test_set / final_test_set_business .json'):
        js = json.loads(line)
        bid = js['business_id']
        cite = js['city']
        cite = cite.lower()
        bid\_city\_map[bid] = cite
22
        if cite not in all_cname:
            all_cname.append(cite)
    id_map = GetReviewIdMap.GetIdPairByRid()
   uid_map = GetIdMap.GetUserMap()
    bid_map = GetIdMap.GetItemMap()
    uid\_city\_map = \{\}
    for rid in id_map:
        uid, bid = id_map[rid]
        cname = bid\_city\_map[bid]
        uid = uid\_map[uid]
        bid = bid\_map[bid]
        cname = all\_cname.index(cname)
        cname = str(cname)
37
        if uid in uid_city_map:
             if cname not in uid_city_map[uid]:
                uid_city_map[uid]. append(cname)
        else:
            uid\_city\_map[uid] = [cname]
42
    f_{cnt} = len(all_{cname})
    {\rm fFile} \ = {\rm open}(\hbox{'./test/Qiang\_\%d\_UserCity.txt'} \ \% \ {\rm f\_cnt}, \ \hbox{'w'})
    fFile.write('%d\n' % f_cnt)
    for uid in uid_city_map:
        fFile .write('%s\t%s' % (uid, ':1\t'.join(uid_city_map[uid])) + ':1\n')
    fFile.close()
 • UserStreetName.py
    Generate UserStreetName feature.
    import GetReviewIdMap
    import GetIdMap
    bid\_sname\_map = \{\}
    for line in file ('./test/Qiang_1264_Street.txt'):
        parts = line. strip(). split('\t')
        if len(parts) < 2:
            continue
        sname = parts[1]. split(':')[0]
10
        bid\_sname\_map[parts[0]] = sname
    id_map = GetReviewIdMap.GetIdPairByRid()
    uid_map = GetIdMap.GetUserMap()
   bid_map = GetIdMap.GetItemMap()
    uid\_sname\_map = \{\}
    all\_sname = []
    for rid in id_map:
        uid, bid = id_{-map}[rid]
20
        uid = uid\_map[uid]
        bid = bid\_map[bid]
        sname = bid\_sname\_map[bid]
        if '0' == sname:
            continue
```

```
sname = int(sname)
        sname -=1
        sname = str(sname)
        if sname not in all_sname:
            all_sname.append(sname)
30
        if uid in uid_sname_map:
             if sname not in uid_sname_map[uid]:
                uid_sname_map[uid].append(sname)
        else:
            uid\_sname\_map[uid] = [sname]
    f_{\text{-cnt}} = \text{len(all\_sname)}
    fFile = open('./test/Qiang_%d_UserStreetName.txt' % f_cnt, 'w')
    fFile.write('%d\n' % f_cnt)
    for uid in uid_sname_map:
         fFile.write('%s\t%s' % (uid, ':1\t'.join(uid_sname_map[uid])) + ':1\n')
    fFile.close()
 • Zipcode.py
    Generate Zipcode feature.
    import numpy
   import json
    import math
    import re
    business_info = \{\}
    address\_info = \{\}
    addr_detail_info = []
    item_map = \{\}
    def GetBusinessAddress():
        print 'Get_business_address_begin...'
12
        for line in open('./ yelp_training_set / yelp_training_set_business .json'):
            js = json.loads(line)
            bid = js['business\_id']
            add = js['full\_address']
            \# add = add.replace('\n',
17
            business\_info[bid] = [add]
             if add not in address_info:
                 address\_info[add] = [bid]
            else:
                 address_info [add].append(bid)
22
        for line in open('./ final_test_set / final_test_set_business .json'):
            js = json.loads(line)
            bid = js['business\_id']
            add = js['full\_address']
27
            \# \ \mathrm{add} = \mathrm{add.replace}(\ ' \ ' \ ',\ '\ ')
             business\_info[bid] = [add]
             if add not in address_info:
                 address\_info[add] = [bid]
            else:
32
                 address_info [add].append(bid)
        print 'Got_it!_Business_count:_%d,_address_count:_%d' % (len(business_info), len(address_info))
    def ClusteBusinessAddress():
        print 'Cluster_begin ... '
        #TODO: Cluster
        for one in address_info:
            addr = [one, address\_info [one]]
            detail = re. split (' \ n | ,', one)
42
            addr.append(detail)
             addr_detail_info .append(addr)
        print 'Cluster_finish!'
    def GetItemMap():
```

```
for line in file ("itemmap.final"):
             if not line:
                 continue
             parts = line. strip(). split('\t')
             item\_map[parts[0]] = parts[1]
52
    def GenerateClusterFeature():
        print 'Generate_cluster_feature_begin ... '
        zipcodes = \{\}
        # TODO: Generate
        wrongs = []
        stat = \{\}
        zipcodeset = \{\}
        maxId = 1
        for one in addr_detail_info:
62
             pat = r' \_ \backslash w + ? \_ (\backslash d +)'
             cnt = len(one[len(one)-1])
             if cnt not in stat:
                 stat[cnt] = 1
             else:
67
                 stat[cnt] += 1
             ret = re.search(pat, one[len(one)-1][len(one[len(one)-1])-1])
             if not ret:
                 wrongs.append(one)
             else:
72
                 zipcode = str(ret.group(1))
                 if zipcode in zipcodeset:
                     zipcodeid = zipcodeset[zipcode]
                 else:
                     zipcodeid = maxId
77
                     zipcodeset[zipcode] = maxId
                     \max Id += 1
                 for id in one [1]:
                     zipcodes[id] = zipcodeid
        featureFile = open('./test/Qiang_%d_zipcode.txt' % maxId, 'w')
        featureFile.write('%d\n' % maxId)
        for bid in zipcodes:
             featureFile.write('%s\t%d:1\n' % (item_map[bid], zipcodes[bid]))
        for one in wrongs:
             for bid in one [1]:
87
                 featureFile.write('%s\t0:1\n' % (item_map[bid]))
        featureFile.close()
        print 'zip_code_count:%d' % maxId
92
        print 'Generate_cluster_feature_finish!'
    \begin{array}{ll} \text{if} & \_\text{name}\_\_ == \text{'}\_\text{main}\_\_\text{'}: \end{array}
        GetBusinessAddress()
        GetItemMap()
        ClusteBusinessAddress()
        GenerateClusterFeature()
```