
HW6 보고서

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A. SVM 실행 보고서

1. svm.py를 실행하여 svm_learn에 대한 input, svm_classify을 위한 input을 생성한다

svm_input을 생성하는 함수는 다음과 같다.

```
def make_svm_input(input_file_name,stopword_list,stemmer,output_file_name,tf_idf_dic,all_word_list):
    input_file = open(input_file_name)
    output_file = open(output_file_name,'w')

    for line in input_file:
        # line list contains => first element : class , last element : newline
        output_str = ''
        line_list = re.split('\t| ', line)
        delete_stopword(line_list,stopword_list)
        UseStemmer(line_list,stemmer)
        word_cnt = len(line_list) - 2
        #extract words from line_list AND make sorted list ascending order
        temp_list = line_list[1:word_cnt+1]

        sorted_list = []
        for word in all_word_list:
            if word in temp_list:
                sorted_list.append(word)
        #make output string
        if line_list[0] == 'acq':
            output_str += '1'
        else:
            output_str += '-1'
        for word in sorted_list:
            index = all_word_list.index(word)+1
            if tf_idf_dic[word] == 0:
                continue
            output_str += ' '+str(index) + ':' + str(tf_idf_dic[word])
        output_str += '\n'
        output_file.write(output_str)
    return
```

수행결과 다음과 같은 input이 생성된다.

<BNP_train.txt>

1	-1	5:0.006925270059623867	6:0.006101287799200853	8:0.016384554046443005	9:0.016393850816898536	10:0.019789665297985842	12:0.00886691997971888	16
2	-1	8:0.016384554046443005	10:0.019789665297985842	12:0.00886691997971888	15:0.0023581534416526914	17:0.006394307471101231	18:0.021749510836983465	
3	-1	8:0.016384554046443005	10:0.019789665297985842	18:0.021749510836983465	25:0.03353862540732	35:0.0074010424230205344	38:0.016767682627646205	4
4	1	8:0.016384554046443005	9:0.016393850816898536	10:0.019789665297985842	16:0.003842246855271652	17:0.006394307471101231	18:0.021749510836983465	
5	-1	8:0.016384554046443005	9:0.016393850816898536	10:0.019789665297985842	17:0.006394307471101231	18:0.021749510836983465	25:0.03353862540732	28:
6	-1	17:0.006394307471101231	26:0.012593168352602473	38:0.016767682627646205	65:0.00260630723824405	87:0.0033595709815736315	89:0.0040338907009386	
7	1	8:0.016384554046443005	10:0.019789665297985842	17:0.006394307471101231	24:0.009482539841247844	25:0.03353862540732	28:0.009686930293337842	30:
8	-1	8:0.016384554046443005	9:0.016393850816898536	10:0.019789665297985842	17:0.006394307471101231	18:0.021749510836983465	25:0.03353862540732	26:
9	-1	8:0.016384554046443005	10:0.019789665297985842	16:0.003842246855271652	17:0.006394307471101231	18:0.021749510836983465	20:0.00241136703829887	
10	-1	6:0.006101287799200853	8:0.016384554046443005	10:0.019789665297985842	17:0.006394307471101231	25:0.03353862540732	28:0.009686930293337842	32:
11	-1	6:0.006101287799200853	9:0.016393850816898536	17:0.006394307471101231	26:0.012593168352602473	30:0.0022381698942324506	44:0.01314962311078817	
12	-1	8:0.016384554046443005	10:0.019789665297985842	18:0.021749510836983465	25:0.03353862540732	28:0.009686930293337842	35:0.0074010424230205344	3
13	1	6:0.006101287799200853	7:0.00815179893462374	8:0.016384554046443005	9:0.016393850816898536	10:0.019789665297985842	12:0.00886691997971888	17:0
14	-1	8:0.016384554046443005	9:0.016393850816898536	29:0.0021243150555583716	197:0.0035134612281370018	633:0.0031463953020752465	644:0.001732548261	
15	1	8:0.016384554046443005	9:0.016393850816898536	10:0.019789665297985842	12:0.00886691997971888	17:0.006394307471101231	18:0.021749510836983465	2
16	-1	8:0.016384554046443005	18:0.021749510836983465	25:0.03353862540732	26:0.012593168352602473	29:0.0021243150555583716	30:0.0022381698942324506	
17	-1	6:0.006101287799200853	8:0.016384554046443005	10:0.019789665297985842	18:0.021749510836983465	25:0.03353862540732	28:0.009686930293337842	34:
18	1	8:0.016384554046443005	9:0.016393850816898536	10:0.019789665297985842	14:0.009400377083638752	16:0.003842246855271652	25:0.03353862540732	26:0
19	1	6:0.006101287799200853	8:0.016384554046443005	17:0.006394307471101231	18:0.021749510836983465	25:0.03353862540732	26:0.012593168352602473	30:0
20	-1	8:0.016384554046443005	9:0.016393850816898536	10:0.019789665297985842	12:0.00886691997971888	16:0.003842246855271652	18:0.021749510836983465	
21	-1	8:0.016384554046443005	10:0.019789665297985842	18:0.021749510836983465	25:0.03353862540732	28:0.009686930293337842	35:0.0074010424230205344	3
22	1	5:0.006925270059623867	6:0.006101287799200853	8:0.016384554046443005	9:0.016393850816898536	10:0.019789665297985842	12:0.00886691997971888	16:
23	-1	8:0.016384554046443005	18:0.021749510836983465	25:0.03353862540732	26:0.012593168352602473	30:0.0022381698942324506	41:0.0037066875709585263	
24	-1	8:0.016384554046443005	17:0.006394307471101231	18:0.021749510836983465	25:0.03353862540732	26:0.012593168352602473	40:0.019268873882164243	44
25	1	1:0.0022120041805741065	7:0.00815179893462374	8:0.016384554046443005	9:0.016393850816898536	10:0.019789665297985842	12:0.00886691997971888	25:
26	-1	7:0.00815179893462374	8:0.016384554046443005	10:0.019789665297985842	18:0.021749510836983465	24:0.009482539841247844	25:0.03353862540732	26:0
27	-1	16:0.003842246855271652	82:0.001189404408621469	96:0.0008451727296910197	103:0.008252190416672647	156:0.0004022423421329334	229:0.0.00068918507	
28	1	6:0.006101287799200853	7:0.00815179893462374	8:0.016384554046443005	10:0.019789665297985842	14:0.009400377083638752	18:0.021749510836983465	24
29	1	8:0.016384554046443005	103:0.008252190416672647	305:0.0033347224507954353	357:0.0017931661370381663	420:0.008703935648928405	776:0.00160879481	
30	1	1:0.0022120041805741065	6:0.006101287799200853	7:0.00815179893462374	8:0.016384554046443005	9:0.016393850816898536	10:0.019789665297985842	17:
31	-1	1:0.0022120041805741065	7:0.00815179893462374	96:0.0008451727296910197	276:0.0006159909698862033	545:0.0009191817490044648	630:0.000759065239	
32	-1	8:0.016384554046443005	10:0.019789665297985842	18:0.021749510836983465	25:0.03353862540732	38:0.016767682627646205	44:0.013149623110788171	49
33	-1	7:0.00815179893462374	630:0.0007590652399220948	1374:0.0003548551460239322	3532:8.707760798605029e-05	6785:0.0001050805195912532	7040:9.10823	
34	-1	8:0.016384554046443005	10:0.019789665297985842	18:0.021749510836983465	25:0.03353862540732	28:0.009686930293337842	30:0.0022381698942324506	3
35	-1	17:0.006394307471101231	24:0.009482539841247844	96:0.0008451727296910197	103:0.008252190416672647	276:0.0006159909698862033	545:0.00091918174	
36	-1	6:0.006101287799200853	7:0.00815179893462374	17:0.006394307471101231	96:0.0008451727296910197	630:0.0007590652399220948	732:0.000552302898173	
37	-1	7:0.00815179893462374	17:0.006394307471101231	30:0.0022381698942324506	96:0.0008451727296910197	226:0.0011315820741369753	276:0.0006159909698	
38	-1	24:0.009482539841247844	84:0.0035845380169542283	103:0.008252190416672647	630:0.0007590652399220948	1374:0.0003548551460239322	3532:8.7077607	
39	-1	6:0.006101287799200853	7:0.00815179893462374	8:0.016384554046443005	10:0.019789665297985842	17:0.006394307471101231	18:0.021749510836983465	2
40	-1	96:0.0008451727296910197	550:0.007506216789287258	630:0.0007590652399220948	732:0.0005523028981734246	1374:0.0003548551460239322	2059:0.000313	
41	-1	6:0.006101287799200853	10:0.019789665297985842	24:0.009482539841247844	26:0.012593168352602473	65:0.00260630723824405	96:0.000845172729691019	
42	-1	7:0.00815179893462374	24:0.009482539841247844	26:0.012593168352602473	96:0.0008451727296910197	135:0.0030232377675683876	180:0.00438293796260	
43	-1	17:0.006394307471101231	96:0.0008451727296910197	103:0.008252190416672647	276:0.0006159909698862033	545:0.0009191817490044648	732:0.000552302	
44	-1	1:0.0022120041805741065	6:0.006101287799200853	8:0.016384554046443005	9:0.016393850816898536	10:0.019789665297985842	17:0.006394307471101231	
45	1	7:0.00815179893462374	8:0.016384554046443005	10:0.019789665297985842	18:0.021749510836983465	25:0.03353862540732	26:0.012593168352602473	31:0:
46	-1	16:0.003842246855271652	96:0.0008451727296910197	103:0.008252190416672647	135:0.0030232377675683876	545:0.0009191817490044648	732:0.000552302	

[illegible][illegible]


```
model.txt
SVM-light Version V6.02
0 # kernel type
3 # kernel parameter -d
1 # kernel parameter -g
1 # kernel parameter -s
1 # kernel parameter -r
empty# kernel parameter -u
8172 # highest feature index
5485 # number of training documents
1238 # number of support vectors plus 1
1.1544428 # threshold b, each following line is a SV (starting with alpha*y)
-566.53888571579159361135680228472 8:0.016384553 10:0.019789666 18:0.021749511
25:0.033538625 38:0.016767683 44:0.013149623 50:0.0055565289 54:0.01810213
96:0.00084517273 124:0.00035734026 126:0.0059264963 127:0.0013702284 133:0.0026865716
147:0.0022198537 200:0.0052741929 201:0.014689588 299:0.0022997088 305:0.0033347225
313:0.0029094089 358:0.0010465623 430:0.0012855664 458:0.0020801506 459:0.0016814971
479:0.0034885367 529:0.00045332962 542:0.00629802 608:0.0036667094 688:0.0010800606
730:0.0013370522 735:0.0015095737 765:0.00076288299 770:0.0021074559 805:0.0017250171
842:0.0023054637 904:0.0010132007 943:0.0016537941 952:0.003111905 996:0.0025563736
1083:0.00030468579 1164:0.00024531482 1214:0.0017381095 1436:7.5814693e-05
1461:0.00084322499 1469:0.00013129524 1602:0.00028902653 1608:0.0013359392
1862:0.0020361268 1920:0.00016296659 2125:0.00019040664 2322:0.00025224363
2529:0.00013224162 2530:0.00013224162 3287:0.00022425821 3449:5.3055381e-05
3457:0.00023670334 5767:8.3212457e-05 5974:8.8161076e-05 #
566.53888571579159361135680228472 5:0.00692527 6:0.0061012879 8:0.016384553 10:0.019789666
14:0.0094003771 18:0.021749511 25:0.033538625 26:0.012593169 35:0.0074010426
38:0.016767683 40:0.019268874 54:0.01810213 77:0.0016064595 80:0.0052598831
96:0.00084517273 131:0.0044333953 132:0.0012673686 197:0.0035134612 201:0.014689588
212:0.00053734303 267:0.005499742 291:0.0027949237 327:0.0027215697 348:0.0031609824
357:0.0017931662 363:0.0021962137 514:0.0021314137 550:0.0075062169 556:0.0032876073
```

3. BNP_test.txt와 model.txt로 svm_classify 작업을 수행

```
gimjaeguui-MacBook-Pro:svm_light_osx.8.4_i7 jaegu$ ./svm_classify BNP_test.txt model.txt output.txt
Reading model...OK. (1237 support vectors read)
Classifying test examples..100..200..300..400..500..600..700..800..900..1000..1100..1200..1300..1400..1500..1600..1700..1800..1900..2000..2100..done
Runtime (without IO) in cpu-seconds: 0.00
Accuracy on test set: 95.48% (2090 correct, 99 incorrect, 2189 total)
Precision/recall on test set: 97.61%/87.93%
```

작업 수행결과 95.48%의 정확도가 나옴을 확인할 수 있다.

B. Adaboost 구현코드 및 실행결과

1. model1, model2 생성

```
#make_expected_value_list
expected_val_list = make_expected_val_list(train_input_f_name)
#make_output_files
first_output_name = 'input1.txt'
second_output_name = 'input2.txt'

output_f1_name = 'output1.txt'
output_f2_name = 'output2.txt'
make_svm_input(train_input_f_name,stopword_list,stemmer,first_output_name,tf_idf_dic,complete_word_list)
print('##### model1 생성 #####')
os.system("./svm_learn input1.txt model1.txt")
os.system("./svm_classify input1.txt model1.txt "+ output_f1_name)
new_weight_list = make_new_weight_list(output_f1_name,expected_val_list,len(expected_val_list))
make_new_svm_input(train_input_f_name,stopword_list,stemmer,second_output_name,tf_idf_dic,complete_word_list,new_weight_list)
print('##### model2 생성 #####')
os.system("./svm_learn input2.txt model2.txt")
os.system("./svm_classify input2.txt model2.txt "+ output_f2_name)
```

input 파일을 생성하기 전에 svm_classify의 결과로 생성된 output.txt 바탕으로 에러를 계산해야 하므로 output.txt를 내용으로 리스트를 생성한다.

```
def make_output_list(input_file_name):
    input_file = open(input_file_name)
    output_list = []

    for output_val in input_file:
        if float(output_val) > 0:
            output_list.append(1)
        else:
            output_list.append(-1)

    return output_list
```

그리고 가중치를 곱한후 새로운 input 파일 생성하고 model2를 생성한다.
weight를 구하는 함수는 다음과 같다.

1 -1 5:0.00692827435863014 6:0.0163934614004152 8:0.016391661943006126 9:0.016400962746557862 10:0.019798250389380954 0.008876766599521327 25:
2 -1 8:0.016391661943006126 10:0.019798250389380954 12:0.008876766599521327 15:0.02359176488485573 17:0.006397081429729359 18:0.02175894614250899
3 -1 8:0.016391661943006126 10:0.019798250389380954 18:0.02175894614250899 25:0.0335317503006766 35:0.00740821320354925 38:0.0167749561731865839
4 1 8:0.01639243605003192 9:0.016401737292820226 10:0.01979185374788662 16:0.003840958127235924 17:0.00639708138356174041 18:0.02175997372306346
5 -1 8:0.016391661943006126 10:0.016400962746557862 10:0.019798250389380954 17:0.006397081429729359 18:0.02175894614250899 25:0.0335317503006766
6 -1 17:0.006397081429729359 26:0.012598631481949694 38:0.0167749561731865503 65:0.0026874378983894915 87:0.00336192802266549 89:0.00345640670926
7 1 8:0.01639243605003192 10:0.01979185374788662 17:0.00639738356174041 24:0.0094871540812984 25:0.033534750800646314 28:0.00969159031759735
8 -1 8:0.016391661943006126 10:0.016400962746557862 10:0.019798250389380954 17:0.006397081429729359 18:0.02175894614250899 25:0.0335317503006766
9 -1 8:0.016391661943006126 10:0.019798250389380954 16:0.003843913666919302 17:0.006397081429729359 18:0.02175894614250899 20:0.00241241313008968
10 1 6:0.006103934641004152 8:0.016391661943006126 10:0.019798250389380954 17:0.006397081429729359 25:0.0335317503006766 28:0.009691132647478456
11 -1 6:0.006103934641004152 9:0.016400962746557862 17:0.006397081429729359 26:0.012598631481949694 30:0.022391408501738694 44:0.01315352730631761
12 1 8:0.016391661943006126 10:0.019798250389380954 18:0.02175894614250899 25:0.0335317503006766 28:0.009691132647478456 35:0.007404251320354925
13 1 6:0.006103934641004152 7:0.00815533522826092 8:0.016391661943006126 9:0.016400962746557862 10:0.019798250389380954 12:0.008876766599521327 15:
14 1 8:0.016391661943006126 9:0.016400962746557862 29:0.002125236619345801 197:0.0035149854270207395 633:0.0031477602615541827 644:0.0017332998706
15 1 8:0.01639243605003192 9:0.016401737292820226 10:0.01979185374788662 12:0.00887185527313563 17:0.00639738356174041 18:0.02175997372306346
16 -1 8:0.016391661943006126 10:0.02175894614250899 25:0.0335317503006766 26:0.012598631481949694 29:0.02125236619345801 30:0.002239140850173869
17 1 6:0.006103934641004152 8:0.016391661943006126 10:0.019798250389380954 18:0.02175894614250899 25:0.0335317503006766 28:0.009691132647478456
18 -1 8:0.016391661943006126 9:0.016400962746557862 10:0.019798250389380954 14:0.0094045126152173 16:0.003843913666919302 25:0.0335317503006766
19 1 6:0.006103934641004152 8:0.016391661943006126 17:0.006397081429729359 18:0.02175894614250899 25:0.0335317503006766 26:0.012598631481949694
20 -1 8:0.016391661943006126 9:0.016400962746557862 10:0.019798250389380954 12:0.008876766599521327 15:0.00639738356174041 18:0.02175894614250899
21 8:0.016391661943006126 10:0.019798250389380954 18:0.02175894614250899 25:0.0335317503006766 28:0.009691132647478456 35:0.007404251320354925
22 1 5:0.00692827435863014 6:0.006103934641004152 8:0.016391661943006126 9:0.016400962746557862 10:0.019798250389380954 12:0.008876766599521327 16:
23 1 8:0.01639243605003192 18:0.02175997372306346 25:0.033534750800646314 26:0.0125992264060615834 30:0.00223924659874532 41:0.003708407712397315
24 -1 8:0.016391661943006126 17:0.006397081429729359 18:0.02175894614250899 25:0.0335317503006766 26:0.012598631481949694 40:0.01927723304543802
25 1 1:0.00221296378538655 7:0.00815533522826092 8:0.016391661943006126 9:0.016400962746557862 10:0.019798250389380954 12:0.008876766599521327 25:
26 -1 7:0.00815533522826092 8:0.016391661943006126 10:0.019798250389380954 18:0.02175894614250899 24:0.009486653527354661 25:0.0335317503006766
27 -1 16:0.003843913666919302 82:0.0011899203923634882 96:0.000845539379107074 103:0.008255770356397258 156:0.005402416841661763 229:0.00068948405
28 1 6:0.006103934641004152 7:0.00815533522826092 8:0.016391661943006126 10:0.019798250389380954 14:0.0094045126152173 18:0.02175894614

작업 수행결과 95.48%의 정확도가 나옴을 확인할 수 있다.