week5 & 6 Experiment

1. Week5

• 运行环境:



• TranseE运行:

○ 数据集: "WN18RR"

2. 代码调整

2.1 Transe

```
def set_interact_args():
      parser = argparse.ArgumentParser()
2
      parser.add_argument('--margin', default=5.0,
3
  type=float, required=False, help='Margin loss中
  margin值')
      parser.add_argument('--nbatches', default=100,
4
  type=int, required=False, help='Batch size')
      parser.add_argument('--dim', default=100,
5
  type=int, required=False, help='Embedding size')
      parser.add_argument('--p_norm', default=1,
6
  type=int, required=False, help='能量函数为1范数形式')
      parser.add_argument('--train_times',
  default=1, type=int, required=False, help='epoch-
  训练轮次')
      parser.add_argument('--alpha', default=1,
  type=float, required=False, help='学习率')
      return parser.parse_args()
9
```

2.1.1 原始实验:

```
1 #脚本命令
2 Date=`date +%y%m%d`
3 echo "1.sh back begin at `date +%H:%M:%S`" >> out.log
4 nohup python -u train_transe_FB15K237.py -- margin=5 --nbatches=100 --dim=100 --p_norm=1 -- train_times=1000 --alpha=1 > logs/'./result/transe/transe(5,100,100,1,1000,1).l og'
5 echo "1.sh back end at `date +%H:%M:%S`" >> out.log
```

• 效果呈现:

```
Epoch 998 | loss: 0.213130: 100%
                                              || 999/1000 [10:49<00:00, 1.56it/s]
                                              999/1000 [10:50<00:00, 1.56it/s]
2010
     Epoch 999 | loss: 0.210327: 100%
                                              | 1000/1000 [10:50<00:00, 1.56it/s]
2011
     Epoch 999 | loss: 0.210327: 100%
2012
     Epoch 999 | loss: 0.210327: 100%|
                                              | 1000/1000 [10:50<00:00, 1.54it/s]
                    3120/3134 [00:07<00:00, 452.21it/s]
      100%
                    3134/3134 [00:07<00:00, 406.18it/s]
      no type constraint results:
      metric:
                                 hit@10
                                          hit@3
                                                    hit@1
                 MRR
                       MR
      1(raw):
                  0.138370
                                                    0.226548
                                                                0.000319
     I(raw): 0.138370
r(raw): 0.159494
                                                    0.247926 0.006063
      averaged(raw): 0.148932 4327.350586 0.448149 0.237237 0.003191
 2094 l(filter):
                   0.193350 5134.768555 0.451181
                                                                 0.001276
                                                      0.384812
      r(filter):
                    0.210217
                              3491.129883
                                                                  0.010530
 2096 averaged(filter): 0.201783 4312.949219 0.472399 0.376197
                                                                     0.005903
 2097 0.472399
 2098 0.4723994731903076
```

998/1000 [10:49<00:01, 1.56it/s]

2.1.2 改变margin为4

Epoch 998 | loss: 0.213130: 100%

2009

```
1 Date=`date +%y%m%d`
 echo "2.sh back begin at `date +%H:%M:%S`" >>
  out.log
 nohup python -u train_transe_FB15K237.py --
  margin=4 --nbatches=100 --dim=100 --p_norm=1 --
  train_times=1000 --alpha=1 >
  logs/'./result/transe/transe(4,100,100,1,1000,1).l
  og'
4 echo "2.sh back end at `date +%H:%M:%S`" >>
  out.log
```

```
Epoch 997 | loss: 0.065870: 100%
                                                   997/1000 [10:54<00:01, 1.52it/s]
      Epoch 997 | loss: 0.065870: 100%
                                                 || 998/1000 [10:54<00:01, 1.52it/s]
                                                 || 998/1000 [10:55<00:01, 1.52it/s]
      Epoch 998 | loss: 0.069522: 100%
                                                   999/1000 [10:55<00:00, 1.53it/s]
      Epoch 998 | loss: 0.069522: 100%
                                                 999/1000 [10:56<00:00, 1.53it/s]
     Epoch 999 | loss: 0.068871: 100%|
                                                 | 1000/1000 [10:56<00:00, 1.54it/s]
      Epoch 999 | loss: 0.068871: 100%|
      Epoch 999 | loss: 0.068871: 100%|
                                                 | 1000/1000 [10:56<00:00, 1.52it/s]
2012
```

```
3134/3134 [00:07<00:00, 395.70it/s]
     no type constraint results:
     metric:
                MRR MR
                               hit@10
                                       hit@3
                                                hit@1
                 0.133139
                                      0.407467
     1(raw):
                                                             0.000000
                                                  0.233567 0.004467
     r(raw):
     averaged(raw):
                     0.141189 4802.496094 0.432993
                                                       0.227026
                                                                  0.002234
     l(filter):
                 0.189913 5959.667969 0.434269
                                                  0.366305
                                                              0.001276
                           3616.461670 0.471602
     r(filter):
                                                              0.005105
     averaged(filter): 0.194850 4788.064941 0.452936 0.371091
                                                                  0.003191
2098
     0.452936
     0.4529355466365814
```

虽然loss降得很低,但是测试结果却发生了一定下降,所以该参数条件下造成了过拟合

2.1.3 改变p_norm为2

```
Epoch 996 | loss: 400.414801: 100%
                                                 996/1000 [10:56<00:02, 1.58it/s]
2005
      Epoch 996 | loss: 400.414801: 100%
                                                 997/1000 [10:56<00:01, 1.55it/s]
      Epoch 997 | loss: 400.444719: 100%
                                                997/1000 [10:56<00:01, 1.55it/s]
      Epoch 997 | loss: 400.444719: 100%
                                                998/1000 [10:56<00:01, 1.54it/s]
                                                 998/1000 [10:57<00:01, 1.54it/s]
      Epoch 998 | loss: 400.467891: 100%
                                                    999/1000 [10:57<00:00, 1.53it/s]
      Epoch 998
               loss: 400.467891: 100%
      Epoch 999 | loss: 400.370608: 100%
                                                    999/1000 [10:58<00:00, 1.53it/s]
      Epoch 999 | loss: 400.370608: 100%
                                                   1000/1000 [10:58<00:00, 1.51it/s]
2012
      Epoch 999 | loss: 400.370608: 100%
                                                   1000/1000 [10:58<00:00, 1.52it/s]
```

```
2095 99%
                   | 3118/3134 [00:08<00:00, 468.29it/s]
                   | 3134/3134 [00:08<00:00, 367.20it/s]
     100%
     no type constraint results:
     metric:
                 MRR
                               hit@10
                                        hit@3
                 0.028054
                           6113.328613 0.057435
                                                  0.029036 0.012125
     1(raw):
                0.064897
                           4102.169922
     r(raw):
                                        0.127632
                                                   0.066369
                                                             0.034142
     averaged(raw):
                      0.046476
                                 5107.749023 0.092534
                                                        0.047703
                                                                   0.023133
     l(filter):
                  0.042108
                            6095.167969 0.073389
                                                    0.043714
                                                               0.024888
     r(filter):
                 0.069423 4098.048340 0.130504
                                                    0.069241
                                                              0.039566
     averaged(filter): 0.055766 5096.608398 0.101946 0.056477
                                                                   0.032227
     0.101946
    0.1019463986158371
```

• 用 l_2 范数发现效果显著下降,这说明 l_2 范数明显不适合此次实验

2.1.4 改变维数为200

```
1 Date=`date +%y%m%d`
 2 echo "5.sh back begin at `date +%H:%M:%S`" >>
   out.log
 3
 4
   nohup python -u train_transe_FB15K237.py --
    margin=5 --nbatches=200 --dim=100 --p_norm=1 --
    train_times=1000 --alpha=1 >
    logs/'./result/transe/transe(5,200,100,1,1000,1).l
    og'
 5 echo "5.sh back end at `date +%H:%M:%S`" >>
    out.log
                                         997/1000 [13:39<00:02, 1.22it/s]
2005
     Epoch 996 | loss: 0.051217: 100%
     Epoch 997 | loss: 0.048420: 100%
                                         997/1000 [13:39<00:02, 1.22it/s]
                                          998/1000 [13:39<00:01, 1.22it/s]
     Epoch 997 | loss: 0.048420: 100%
                                          998/1000 [13:40<00:01, 1.22it/s]
     Epoch 998 | loss: 0.053169: 100%
2009
     Epoch 998 | loss: 0.053169: 100%|
                                          999/1000 [13:40<00:00, 1.22it/s]
     Epoch 999 | loss: 0.053974: 100%
                                         999/1000 [13:41<00:00, 1.22it/s]
                                          | 1000/1000 [13:41<00:00, 1.22it/s]
2011
     Epoch 999 | loss: 0.053974: 100%
     Epoch 999 | loss: 0.053974: 100%|
                                          | 1000/1000 [13:41<00:00, 1.22it/s]
                 3036/3134 [00:09<00:00, 339.45it/s]
2101
                 | 3072/3134 [00:09<00:00, 343.01it/s]
2102
      98%
2103
     99%|
                 | 3116/3134 [00:09<00:00, 368.96it/s]
2104 100%
                 3134/3134 [00:09<00:00, 326.01it/s]
     no type constraint results:
     metric: MRR MR hit@10 hit@3 hit@1
     l(raw): 0.131014 6682.884277 0.408424 0.216018 0.000000 r(raw): 0.147385 3212.349121 0.454052 0.228462 0.004148
     averaged(raw): 0.139199 4947.616699 0.431238 0.222240 0.002074
2109
2110
2111 l(filter): 0.189673 6659.300781 0.434588 0.365029 0.001595
2112 r(filter): 0.200265 3206.929443 0.468092 0.376197 0.004786
2113 averaged(filter): 0.194969 4933.115234 0.451340 0.370613 0.003191
2114 0.451340
2115 0.4513401389122009
```

• 200dim效果并不好,且增加计算开销,所以200 dim不适合

2.1.5 改变n batches为200

```
1 Date=`date +%y%m%d`
 2 echo "5.sh back begin at `date +%H:%M:%S`" >>
    out.log
 3
 4
   nohup python -u train_transe_FB15K237.py --
    margin=5 --nbatches=200 --dim=100 --p_norm=1 --
    train_times=1000 --alpha=1 >
    logs/'./result/transe/transe(5,200,100,1,1000,1).l
    og'
 5 echo "5.sh back end at `date +%H:%M:%S`" >>
    out.log
2005
     Epoch 996 | loss: 0.441036: 100%|
                                          997/1000 [17:54<00:03, 1.09s/it]
     Epoch 997 | loss: 0.441166: 100%
                                          997/1000 [17:55<00:03, 1.09s/it]
     Epoch 997 | loss: 0.441166: 100%|
                                         998/1000 [17:55<00:02, 1.08s/it]
                                          998/1000 [17:56<00:02, 1.08s/it]
     Epoch 998 | loss: 0.441047: 100%
     Epoch 998 | loss: 0.441047: 100%
                                          999/1000 [17:56<00:01, 1.08s/it]
                                          999/1000 [17:57<00:01, 1.08s/it]
     Epoch 999 | loss: 0.437477: 100%
     Epoch 999 | loss: 0.437477: 100%
                                          | 1000/1000 [17:57<00:00, 1.09s/it]
     Epoch 999 | loss: 0.437477: 100%|
                                          | 1000/1000 [17:57<00:00, 1.08s/it]
2012
                 3122/3134 [00:08<00:00, 393.27it/s]
     100%
     100% 3134/3134 [00:08<00:00, 361.24it/s]
     no type constraint results:
     metric: MRR MR hit@10 hit@3
l(raw): 0.138690 5034.560547 0.421506
r(raw): 0.159422 3353.724365 0.475431
                                                hit@1
                                                            0.000319
                                                 0.248883 0.007658
2101
     averaged(raw): 0.149056 4194.142578 0.448468 0.238513 0.003989
     l(filter): 0.195667 5011.101562 0.451819 0.372048 0.002553
2104 r(filter): 0.209843 3348.364746 0.488832 0.380664 0.012125
     averaged(filter): 0.202755 4179.733398 0.470325 0.376356 0.007339
     0.470325
```

• 200 batch效果有所下降

2.1.6 学习率调为0.5

2107 0.4703254699707031

```
1 Date=`date +%y%m%d`
   echo "6.sh back begin at `date +%H:%M:%S`" >>
    out.log
 3
 4
    nohup python -u train_transe_FB15K237.py --
    margin=5 --nbatches=100 --dim=100 --p_norm=1 --
    train_times=1000 --alpha=0.5 >
    logs/'./result/transe/transe(5,100,100,1,1000,0.5)
    .log'
 5 echo "6.sh back end at `date +%H:%M:%S`" >>
    out.log
                                          996/1000 [10:12<00:02, 1.64it/s]
2003
     Epoch 995 | loss: 0.208036: 100%
     Epoch 996 | loss: 0.205459: 100%
                                          996/1000 [10:13<00:02, 1.64it/s]
2004
     Epoch 996 | loss: 0.205459: 100%
                                          997/1000 [10:13<00:01, 1.62it/s]
     Epoch 997 | loss: 0.201967: 100%
                                          997/1000 [10:14<00:01, 1.62it/s]
     Epoch 997 | loss: 0.201967: 100%
                                          998/1000 [10:14<00:01, 1.60it/s]
2007
     Epoch 998 | loss: 0.209225: 100%
                                           || 998/1000 [10:14<00:01, 1.60it/s]
                                          | 999/1000 [10:14<00:00, 1.61it/s]
     Epoch 998 | loss: 0.209225: 100%
     Epoch 999 | loss: 0.207769: 100%
                                          999/1000 [10:15<00:00, 1.61it/s]
2011
     Epoch 999 | loss: 0.207769: 100%
                                          | 1000/1000 [10:15<00:00, 1.63it/s]
     Epoch 999 | loss: 0.207769: 100%
                                           1000/1000 [10:15<00:00, 1.63it/s]
                  3103/3134 [00:07<00:00, 394.64it/s]
     100%
                  3134/3134 [00:07<00:00, 398.11it/s]
     no type constraint results:
2089
2090 metric: MRR MR
                               hit@10 hit@3
                                                hit@1
2091 l(raw): 0.139823 5140.723145 0.421187 0.230696 0.000000 2092 r(raw): 0.158415 3528.097412 0.479579 0.250479 0.006063
     averaged(raw): 0.149119 4334.410156 0.450383 0.240587 0.003031
2094
     l(filter):
                 0.196255 5117.284180 0.454690 0.370134
                                                              0.002872
     r(filter): 0.210339 3522.729736 0.494576 0.385769 0.011168
2096
     averaged(filter): 0.203297 4320.006836 0.474633 0.377952 0.007020
2098 0.474633
```

• 学习率降低后,效果有一定上升

2.1.7 epoch调维500

2099 0.47463303804397583

```
Date=`date +%y%m%d`
echo "7.sh back begin at `date +%H:%M:%S`" >>
out.log

nohup python -u train_transe_FB15K237.py --
margin=5 --nbatches=100 --dim=100 --p_norm=1 --
train_times=500 --alpha=1 >
logs/'./result/transe/transe(5,100,100,1,500,1).lo
g'
echo "7.sh back end at `date +%H:%M:%S`" >>
out.log

Epoch 496 loss: 0.265535: 99% 497/500 [05:06<00:01, 1.67it/s]
```

```
Epoch 497 | loss: 0.271473: 99%
                                               497/500 [05:07<00:01, 1.67it/s]
      Epoch 497 | loss: 0.271473: 100%
                                               498/500 [05:07<00:01, 1.67it/s]
      Epoch 498 | loss: 0.268631: 100%
                                               498/500 [05:08<00:01, 1.67it/s]
1008
      Epoch 498 | loss: 0.268631: 100%
                                                || 499/500 [05:08<00:00, 1.67it/s]
1009
1010
      Epoch 499 | loss: 0.251173: 100%
                                               499/500 [05:08<00:00, 1.67it/s]
1011
      Epoch 499 | loss: 0.251173: 100%|
                                               | 500/500 [05:08<00:00, 1.67it/s]
      Epoch 499 | loss: 0.251173: 100%|
                                                | 500/500 [05:08<00:00, 1.62it/s]
1012
```

```
1086
      99%
                    | 3118/3134 [00:07<00:00, 446.40it/s]
1087
      100%
                   3134/3134 [00:07<00:00, 405.24it/s]
1088 no type constraint results:
1089 metric: MRR MR
                                  hit@10
                                            hit@3
                                                      hit@1
                  0.136213 4858.082520 0.421825 0.218571 0.000000
1090 l(raw): 0.136213 4858.082520 0.421825 0.218571 0.000000
1091 r(raw): 0.155674 3397.925293 0.473197 0.238034 0.007339
      averaged(raw): 0.145943 4128.003906 0.447511 0.228302 0.003669
1092
1093
                  0.1928714834.6064450.4540520.3640710.0019140.2076373392.5395510.4888320.3784300.012125
1094
      l(filter):
1095
      r(filter):
1096
     averaged(filter): 0.200254 4113.573242 0.471442 0.371251 0.007020
1097
    0.471442
```

• 发现训练500 epoch的loss降低了一半,且测试结果与原始条件相差甚微,所以预估训练的最佳epoch在500~1000epochs

2.2 Transh

2.2.1 原始条件

```
1 Date=`date +%y%m%d`
 2 echo "8.sh back begin at `date +%H:%M:%S`" >>
    out.log
 3
 4
    nohup python -u train_transh_FB15K237.py --
    margin=4 --nbatches=100 --dim=100 --p_norm=1 --
    train_times=1000 --alpha=0.5 >
    logs/'./result/transh/transh(4,100,100,1,1000,0.5)
    .log'
 5 echo "8.sh back end at `date +%H:%M:%S`" >>
    out.log
                                            | 997/1000 [15:52<00:02, 1.10it/s]
2005
     Epoch 996 | loss: 0.059751: 100%
     Epoch 997 | loss: 0.059463: 100%
                                            997/1000 [15:53<00:02, 1.10it/s]
2006
     Epoch 997 | loss: 0.059463: 100%
                                           998/1000 [15:53<00:01, 1.13it/s]
2007
2008
     Epoch 998 | loss: 0.062854: 100%|
                                           998/1000 [15:53<00:01, 1.13it/s]
                                            || 999/1000 [15:53<00:00, 1.11it/s]
     Epoch 998 | loss: 0.062854: 100%|
2009
                                            | 999/1000 [15:54<00:00, 1.11it/s]
     Epoch 999 | loss: 0.063306: 100%
2011
     Epoch 999 | loss: 0.063306: 100%|
                                            | 1000/1000 [15:54<00:00, 1.10it/s]
2012 Epoch 999 | loss: 0.063306: 100%
                                            | 1000/1000 [15:54<00:00, 1.05it/s]
2119 100%
                  3122/3134 [00:11<00:00, 312.95it/s]
2120 100% 3134/3134 [00:11<00:00, 266.22it/s]
2121 no type constraint results:
2122 metric: MRR MR
                               hit@10 hit@3
                                                 hit@1
2123 l(raw): 0.134871 6491.286621 0.409700 0.228143 0.000000 2124 r(raw): 0.149951 3728.079102 0.455967 0.240587 0.005105
     averaged(raw): 0.142411 5109.682617 0.432833 0.234365 0.002553
2125
2126
     l(filter): 0.192379 6467.757324 0.434269 0.374920 0.001595 r(filter): 0.203356 3722.689453 0.467773 0.380664 0.007020
2129 averaged(filter): 0.197868 5095.223633 0.451021 0.377792 0.004308
2130 0.451021
2131 0.45102107524871826
```

2.2.2 margin改为5

```
1 Date=`date +%y%m%d`
 2 echo "9.sh back begin at `date +%H:%M:%S`" >>
    out.log
 3
 4
   nohup python -u train_transh_FB15K237.py --
    margin=5 --nbatches=100 --dim=100 --p_norm=1 --
    train_times=1000 --alpha=0.5 >
    logs/'./result/transh/transh(5,100,100,1,1000,0.5)
    .log'
 5 echo "9.sh back end at `date +%H:%M:%S`" >>
    out.log
     Epoch 995 | loss: 0.187397: 100%
     Epoch 996 | loss: 0.178820: 100%
                                        996/1000 [16:20<00:03, 1.12it/s]
2005
     Epoch 996 | loss: 0.178820: 100%
                                        997/1000 [16:20<00:02, 1.13it/s]
                                         997/1000 [16:21<00:02, 1.13it/s]
     Epoch 997 | loss: 0.178085: 100%
     Epoch 997 | loss: 0.178085: 100%
                                         998/1000 [16:21<00:01, 1.09it/s]
     Epoch 998 | loss: 0.183935: 100%
                                         998/1000 [16:22<00:01, 1.09it/s]
                                         999/1000 [16:22<00:00, 1.09it/s]
2009 Epoch 998 | loss: 0.183935: 100%|
                                         999/1000 [16:23<00:00, 1.09it/s]
2010
     Epoch 999 | loss: 0.183669: 100%
2011
     Epoch 999 | loss: 0.183669: 100%
                                         | 1000/1000 [16:23<00:00, 1.11it/s]
2012 Epoch 999 | loss: 0.183669: 100%|
                                         | 1000/1000 [16:23<00:00, 1.02it/s]
     99%
                 3113/3134 [00:11<00:00, 261.95it/s]
2121
2122 100% 3134/3134 [00:11<00:00, 263.24it/s]
     no type constraint results:
2124 metric: MRR MR
                              hit@10 hit@3
                                               hit@1
2125 l(raw): 0.138006 5210.297852 0.422463 0.228462 0.0000000 2126 r(raw): 0.159668 3527.291260 0.477664 0.249840 0.007339
     averaged(raw): 0.148837 4368.794434 0.450064 0.239151
2127
                                                                0.003669
2128
2129 l(filter):
                 0.195326 5186.865234 0.451819 0.371729
                                                             0.002234
     r(filter): 0.212261 3521.917725 0.492342 0.386088 0.012125
2130
     averaged(filter): 0.203794 4354.391602 0.472080 0.378909 0.007179
2131
2132 0.472080
2133 0.47208040952682495
```

• 效果强于原始条件,有较大提升

2.2.3 n_batches改为200

```
1 Date=`date +%y%m%d`
 2 echo "10.sh back begin at `date +%H:%M:%S`" >>
    out.log
 3
 4
   nohup python -u train_transh_FB15K237.py --
    margin=4 --nbatches=200 --dim=100 --p_norm=1 --
    train_times=1000 --alpha=0.5 >
    logs/'./result/transh/transh(4,200,100,1,1000,0.5)
    .log'
 5 echo "10.sh back end at `date +%H:%M:%S`" >>
    out.log
     Epoch 997 | loss: 0.124270: 100%|
                                             998/1000 [27:44<00:04, 2.47s/it]
                                           998/1000 [27:46<00:04, 2.47s/it]
     Epoch 998 | loss: 0.120987: 100%|
2008
2009 Epoch 998 | loss: 0.120987: 100%|
                                           999/1000 [27:46<00:02, 2.35s/it]
2010 Epoch 999 | loss: 0.121911: 100%
                                          999/1000 [27:48<00:02, 2.35s/it]
                                          1000/1000 [27:48<00:00, 2.24s/it]
2011 Epoch 999 | loss: 0.121911: 100%
2012 Epoch 999 | loss: 0.121911: 100%|
                                           | 1000/1000 [27:48<00:00, 1.67s/it]
2130 100%| 3134/3134 [00:13<00:00, 228.13it/s]
2131 no type constraint results:
2132 metric: MRR MR hit@10 hit@3 hit@1
2133 l(raw): 0.133892 6120.731445 0.406509 0.224633 0.000000 2134 r(raw): 0.150489 3729.130615 0.447990 0.244097 0.005424
2135 averaged(raw): 0.142190 4924.931152 0.427250 0.234365 0.002712
2136
2137 l(filter): 0.190570 6097.273926 0.431078 0.370453 0.001914
2138 r(filter): 0.202768 3723.750488 0.461391 0.381940 0.007020
2139 averaged(filter): 0.196669 4910.512207 0.446235 0.376197 0.004467
2140 0.446235
```

• 无显著提升,但至少没有过拟合

2.2.4 dim改为200

```
1 Date=`date +%y%m%d`
 2 echo "11.sh back begin at `date +%H:%M:%S`" >>
    out.log
 3
 4
    nohup python -u train_transh_FB15K237.py --
    margin=4 --nbatches=100 --dim=200 --p_norm=1 --
    train_times=1000 --alpha=0.5 >
    logs/'./result/transh/transh(4,100,200,1,1000,0.5)
     .log'
 5 echo "11.sh back end at `date +%H:%M:%S`" >>
    out.log
     Epoch 996 | loss: 0.030468: 100%
                                             997/1000 [20:40<00:03, 1.11s/it]
     Epoch 997 | loss: 0.029040: 100%|
                                             997/1000 [20:41<00:03, 1.11s/it]
                                             998/1000 [20:41<00:02, 1.10s/it]
      Epoch 997 | loss: 0.029040: 100%|
2007
     Epoch 998 | loss: 0.031466: 100%|
                                             998/1000 [20:42<00:02, 1.10s/it]
2008
                                             999/1000 [20:42<00:01, 1.09s/it]
2009
     Epoch 998 | loss: 0.031466: 100%
                                             999/1000 [20:43<00:01, 1.09s/it]
     Epoch 999 | loss: 0.031822: 100%
      Epoch 999 | loss: 0.031822: 100%|
                                              | 1000/1000 [20:43<00:00, 1.09s/it]
2012 Epoch 999 | loss: 0.031822: 100%|
                                               1000/1000 [20:43<00:00, 1.24s/it]
                3133/3134 [00:24<00:00, 91.52it/s]
     100%
2191 100%
                  3134/3134 [00:24<00:00, 125.39it/s]
2192 no type constraint results:
2193 metric: MRR MR hit@10 hit@3 hit@1
     l(raw): 0.125150 7965.114258 0.391512 0.206126 0.000000 r(raw): 0.139344 3804.763184 0.432355 0.223676 0.001595
2194 l(raw):
     averaged(raw): 0.132247 5884.938477 0.411934 0.214901 0.000798

      0.182157
      7941.565918
      0.409381
      0.355456
      0.000957

      0.192034
      3799.331543
      0.441927
      0.368220
      0.001914

     l(filter):
     r(filter):
     averaged(filter): 0.187096 5870.448730 0.425654 0.361838
                                                                     0.001436
     0.425654
2202 0.4256541132926941
```

• 发生了严重过拟合

2.2.5 p_norm改为2

```
1 Date=`date +%y%m%d`
 2 echo "12.sh back begin at `date +%H:%M:%S`" >>
    out.log
 3
 4
    nohup python -u train_transh_FB15K237.py --
    margin=4 --nbatches=100 --dim=100 --p_norm=2 --
    train_times=1000 --alpha=0.5 >
    logs/'./result/transh/transh(4,100,100,2,1000,0.5)
    .log'
 5 echo "12.sh back end at `date +%H:%M:%S`" >>
    out.log
                                            | 997/1000 [16:26<00:02, 1.15it/s]
2005 Epoch 996 | loss: 290.810003: 100%
2006 Epoch 997 | loss: 290.803325: 100%|
                                          997/1000 [16:27<00:02, 1.15it/s]
                                          998/1000 [16:27<00:01, 1.15it/s]
2007 Epoch 997 | loss: 290.803325: 100%|
                                           | 998/1000 [16:27<00:01, 1.15it/s]
2008 Epoch 998 | loss: 291.046695: 100%|
2009 Epoch 998 | loss: 291.046695: 100%|
                                           999/1000 [16:27<00:00, 1.13it/s]
2010 Epoch 999 | loss: 290.985742: 100%|
                                           999/1000 [16:28<00:00, 1.13it/s]
2011 Epoch 999 | loss: 290.985742: 100%|
                                           | 1000/1000 [16:28<00:00, 1.14it/s]
2012 Epoch 999 | loss: 290.985742: 100%|
                                           | 1000/1000 [16:28<00:00, 1.01it/s]
  2125 100% 3134/3134 [00:12<00:00, 258.03it/s]
  2126 no type constraint results:
 2127 metric: MRR MR hit@10 hit@3
                                              hit@1
 2128 l(raw): 0.012927 7268.114746 0.030632 0.012125 0.002553 2129 r(raw): 0.043794 6866.465820 0.082642 0.046586 0.021378
 2130 averaged(raw): 0.028360 7067.290039 0.056637 0.029355 0.011966
 2132 l(filter):
                  0.021719 7247.605469 0.042119 0.022655 0.009572
 2133 r(filter): 0.046703 6861.593262 0.083599 0.048500 0.025207
 2134 averaged(filter): 0.034211 7054.599609 0.062859 0.035578 0.017390
 2135 0.062859
```

• 整个模型都坏掉,实在不适合

2.2.6 epoch改为500

2136 0.06285896897315979

```
1 Date=`date +%y%m%d`
2 echo "13.sh back begin at `date +%H:%M:%S`" >>
   out.log
3
4
  nohup python -u train_transh_FB15K237.py --
   margin=4 --nbatches=100 --dim=100 --p_norm=1 --
   train_times=500 --alpha=0.5 >
   logs/'./result/transh/transh(4,100,100,1,500,0.5).
   log'
5 echo "13.sh back end at `date +%H:%M:%S`" >>
   out.log
    Epoch 497 | loss: 0.080395: 99%
                                         497/500 [08:37<00:02, 1.06it/s]
                                         498/500 [08:37<00:01, 1.05it/s]
     Epoch 497 | loss: 0.080395: 100%
    Epoch 498 | loss: 0.081110: 100%
                                         498/500 [08:37<00:01, 1.05it/s]
1009 Epoch 498 | loss: 0.081110: 100%
                                         499/500 [08:37<00:00, 1.08it/s]
1010 Epoch 499 | loss: 0.073310: 100%
                                         499/500 [08:38<00:00, 1.08it/s]
1011 Epoch 499 | loss: 0.073310: 100%
                                         | 500/500 [08:38<00:00, 1.07it/s]
1012 Epoch 499 | loss: 0.073310: 100%
                                         500/500 [08:38<00:00, 1.04s/it]
            3116/3134 [00:11<00:00, 300.85it/s]
1116 99%
1117 100%
                3134/3134 [00:11<00:00, 276.56it/s]
1118 no type constraint results:
1119 metric: MRR MR hit@10 hit@3 hit@1
1120 l(raw): 0.131306 6369.646484 0.404595 0.216656 0.0000000 1121 r(raw): 0.151146 4088.569580 0.447990 0.240906 0.006382
1122
    averaged(raw): 0.141226 5229.107910 0.426292 0.228781
                                                               0.003191
1123
1124 l(filter): 0.189459 6346.155762 0.431398 0.366624 0.002553
1125 r(filter):
                0.203111 4083.173340 0.460753 0.376516
                                                          0.011487
1126 averaged(filter): 0.196285 5214.664551 0.446075 0.371570
                                                               0.007020
1127 0.446075
```

• 效果一般, 感觉有点欠拟合

2.2.7 学习率改为1

```
Date=`date +%y%m%d`
echo "14.sh back begin at `date +%H:%M:%S`" >>
out.log

nohup python -u train_transh_FB15K237.py --
margin=4 --nbatches=100 --dim=100 --p_norm=1 --
train_times=1000 --alpha=1 >
logs/'./result/transh/transh(4,100,100,1,1000,1).l
og'
echo "14.sh back end at `date +%H:%M:%S`" >>
out.log
```

```
2005
     Epoch 996 | loss: 0.062057: 100%
                                                 997/1000 [16:34<00:02, 1.11it/s]
                                                | 997/1000 [16:35<00:02, 1.11it/s]
     Epoch 997 | loss: 0.060758: 100%
                                              998/1000 [16:35<00:01, 1.12it/s]
     Epoch 997 | loss: 0.060758: 100%
                                              998/1000 [16:35<00:01, 1.12it/s]
2008
     Epoch 998 | loss: 0.064736: 100%
     Epoch 998 | loss: 0.064736: 100%
                                              999/1000 [16:35<00:00, 1.13it/s]
      Epoch 999 | loss: 0.065083: 100%
                                              999/1000 [16:36<00:00, 1.13it/s]
                                               1000/1000 [16:36<00:00, 1.15it/s]
     Epoch 999 | loss: 0.065083: 100%
     Epoch 999 | loss: 0.065083: 100%|
                                               | 1000/1000 [16:36<00:00, 1.00it/s]
```

```
3126/3134 [00:10<00:00, 272.02it/s]
    100% 3134/3134 [00:10<00:00, 287.48it/s]
2114
    no type constraint results:
2116 metric: MRR MR
                             hit@10 hit@3
                                              hit@1
2117 l(raw):
2118 r(raw):
               0.135098 6139.355469 0.408743 0.228781 0.000000
                                               0.230696 0.004467
              0.147974 3716.475830 0.449585
    averaged(raw): 0.141536 4927.915527 0.429164 0.229738
2119
                                                              0.002234
2120
    l(filter): 0.191477 6115.862305 0.432036 0.371729 0.001276
2122 r(filter): 0.199862 3711.073486 0.462029 0.373325 0.005105
2123 averaged(filter): 0.195670 4913.467773 0.447033 0.372527 0.003191
2124
     0.447033
2125 0.4470325708389282
```

• 过拟合

2. week6



2.1 分别使用EN_FR_15K_V2的split1和 EN_DE_15K_V2的split2来运行MTransE, 记录使用的命令和结果

2.1.1 EN_FR_15K_V2的split1

```
python main_from_args.py
./args/mtranse_args_15K.json EN_FR_15K_V2
721_5fold/1/
```

```
epoch 177, avg. mapping loss: 0.2076, cost time: 1.6305s
epoch 178, avg. triple loss: 0.2771, cost time: 2.4821s
epoch 178, avg. mapping loss: 0.1956, cost time: 1.6316s
epoch 179, avg. triple loss: 0.2765, cost time: 2.4742s
epoch 179, avg. triple loss: 0.2765, cost time: 2.4742s
epoch 179, avg. mapping loss: 0.2093, cost time: 1.6333s
epoch 180, avg. triple loss: 0.2759, cost time: 2.4848s
epoch 180, avg. mapping loss: 0.1992, cost time: 1.5824s
quick results: hits@[1, 5, 10, 50] = [24. 41.6 49.2 67. ]%, time = 0.726 s

== should early stop ==

Training ends. Total time = 785.819 s.
accurate results: hits@[1, 5, 10, 50] = [22.952 41.914 50.6 69.667]%, mr = 217.770, mrr = 0.321593, time = 9.100 s
accurate results: with csls: csls=10, hits@[1, 5, 10, 50] = [32.648 55.105 64.562 82.933]%, mr = 67.767, mrr = 0.433668, time = 12.716 s
Results saved!

./../output/results/MTransE/EN_FR_15K_V2/721_5fold/1/20211206105908/kgl_ent_ids saved.

./../output/results/MTransE/EN_FR_15K_V2/721_5fold/1/20211206105908/kgl_ent_ids saved.

./../output/results/MTransE/EN_FR_15K_V2/721_5fold/1/20211206105908/kgl_rel_ids saved.

./../output/results/MTransE/EN_FR_15K_V2/721_5fold/1/20211206105908/kgl_ent_ids saved.

./../output/results/MTransE/EN_FR_15K_V2/7
```

```
> EN_DE_15K_V2\721_5fold\2\<u>202112061</u>...
                                           http://dbpedia.org/resource/E245396 0

✓ ■ EN_FR_15K_V2\721_5fold\1\202112061...
                                           http://dbpedia.org/resource/E292763 2
  alignment_results_12
                                           http://dbpedia.org/resource/E172224 4
  ent_embeds.npy
                                           http://dbpedia.org/resource/E206541 6
  kg1_attr_ids
                                           http://dbpedia.org/resource/E388971 8
  kg1_ent_embeds_txt
                                           http://dbpedia.org/resource/E204061 10
  kg1_ent_ids
                                           http://dbpedia.org/resource/E380309 12
  kg1_rel_embeds_txt
                                           http://dbpedia.org/resource/E269014 14
  kg1_rel_ids
                                           http://dbpedia.org/resource/E145920 16
  kg2_attr_ids
                                           http://dbpedia.org/resource/E612528 18
  kg2_ent_embeds_txt
                                           http://dbpedia.org/resource/E061882 20
  kg2_ent_ids
  kg2_rel_embeds_txt
                                           http://dbpedia.org/resource/E917119 22
  kg2_rel_ids
                                           http://dbpedia.org/resource/E891999 24
```

```
[ □ □ □ EN_FR_15K_V2 > 721_5fold > 1 > 20211206105908 > kg2_ent_ids
> EN_DE_15K_V2
                                           http://fr.dbpedia.org/resource/E294655

✓ ■ EN_FR_15K_V2\721_5fold\1\202112061...

                                           http://fr.dbpedia.org/resource/E791059
  Alignment results 12
                                           http://fr.dbpedia.org/resource/E319827
  ent_embeds.npy
                                           http://fr.dbpedia.org/resource/E924195
  ka1 attr ids
                                           http://fr.dbpedia.org/resource/E481752
  R ka1 ent embeds txt
                                           http://fr.dbpedia.org/resource/E098676
  kg1_ent_ids
                                           http://fr.dbpedia.org/resource/E859836
                                                                                       13
  kg1_rel_embeds_txt
                                           http://fr.dbpedia.org/resource/E313692
  kg1_rel_ids
                                           http://fr.dbpedia.org/resource/E455185
                                                                                       17
  kg2_attr_ids
                                           http://fr.dbpedia.org/resource/E125020
  kg2_ent_embeds_txt
                                           http://fr.dbpedia.org/resource/E988247
                                                                                       21
  kg2_ent_ids
  kg2_rel_embeds_txt
                                           http://fr.dbpedia.org/resource/E851859
  kg2_rel_ids
                                           http://fr.dbpedia.org/resource/E812144
```

2.1.2 EN_DE_15K_V2的split2

```
python main_from_args.py
./args/mtranse_args_15K.json EN_DE_15K_V2
721_5fold/2/]
```

```
MTRANSE
                     다 다 가 요 EN_DE_15K_V2 > 721_5fold > 2 > 20211206111639 > 🔅 kg1_ent_ids
EN DE 15K V2\721 5fold\2\202112061...
                                      1 http://dbpedia.org/resource/E156265 0
  alignment_results_12
                                          http://dbpedia.org/resource/E940714 2
  ent_embeds.npy
                                          http://dbpedia.org/resource/E737899 4
  kg1_attr_ids
                                          http://dbpedia.org/resource/E183425 6
 kg1_ent_embeds_txt
                                          http://dbpedia.org/resource/E832030 8
  kg1_ent_ids
                                          http://dbpedia.org/resource/E036271 10
  kg1_rel_embeds_txt
                                          http://dbpedia.org/resource/E507224 12
  kg1_rel_ids
                                      8
                                          http://dbpedia.org/resource/E004640 14
  kg2_attr_ids
                                          http://dbpedia.org/resource/E021511 16
  kg2_ent_embeds_txt
                                          http://dbpedia.org/resource/E095770 18
  kg2_ent_ids
                                          http://dbpedia.org/resource/E030112 20
  kg2_rel_embeds_txt
  kg2_rel_ids
                                     12
                                          http://dbpedia.org/resource/E805323 22
  mapping mat.npv
                                          http://dbpedia.org/resource/E014986 24
  rel embeds.npv
                                          http://dbpedia.org/resource/E506020 26
 ■ EN_FR_15K_V2
                                          http://dbpedia.org/resource/E397777 28
                                          http://dbpedia.org/resource/E537013 30
                                          http://dbpedia.org/resource/E635776 32
```

```
[♣ 🗗 🗘 🗗 EN_DE_15K_V2 > 721_5fold > 2 > 20211206111639 > 🌼 kg2_ent_ids
EN_DE_15K_V2\721_5fold\2\202112061...
                                          http://de.dbpedia.org/resource/E209564
                                      1
alignment_results_12
                                          http://de.dbpedia.org/resource/E326381
                                                                                       3
ent_embeds.npy
                                          http://de.dbpedia.org/resource/E931673
kg1_attr_ids
                                          http://de.dbpedia.org/resource/E424305
kg1_ent_embeds_txt
                                          http://de.dbpedia.org/resource/E052472
                                                                                       9
kg1_ent_ids
                                          http://de.dbpedia.org/resource/E402418
kg1_rel_embeds_txt
                                          http://de.dbpedia.org/resource/E994111
                                                                                       13
kg1_rel_ids
                                          http://de.dbpedia.org/resource/E058102
                                                                                       15
kg2_attr_ids
                                          http://de.dbpedia.org/resource/E897209
                                                                                       17
ka2 ent embeds txt
                                     10
                                          http://de.dbpedia.org/resource/E062375
                                                                                       19
kg2_ent_ids
                                     11
                                          http://de.dbpedia.org/resource/E263036
                                                                                       21
kg2_rel_embeds_txt
kg2_rel_ids
                                     12
                                          http://de.dbpedia.org/resource/E012750
                                                                                       23
mapping_mat.npy
                                          http://de.dbpedia.org/resource/E088518
                                                                                       25
                                     13
rel_embeds.npy
                                          http://de.dbpedia.org/resource/E973424
                                                                                       27
                                     14
EN_FR_15K_V2\721_5fold\1\202112061...
                                          http://de.dbpedia.org/resource/E126902
alignment_results_12
```

2.2 mtranse_args_15K.json和 mtranse_args_100K.json有何区别,为什么要设置这种区别,而不是直接写一个 mtranse_args.json?

```
\square \mathbb{P} \downarrow \uparrow
                   ← mtranse_args_15K.json ↔ mtranse_args_100K.json ×
)
penEA-master > run > args > <mark>{-}}</mark> mtranse_args_100K.json > ...
          "dim": 100,
                                                                 "dim": 100,
          "init": "unit",
                                                                 "init": "unit",
          "ent_12_norm": true,
                                                                 "ent_12_norm": true,
                                                                 "rel_l2_norm": true,
          "rel_l2_norm": true,
          "loss_norm": "L2",
                                                                 "loss_norm": "L2",
          "learning_rate": 0.01,
                                                                 "learning_rate": 0.01,
                                                                 "optimizer": "Adagrad",
          "optimizer": "Adagrad",
          "max_epoch": 2000,
                                                                 "max_epoch": 2000,
          "batch_size": 5000,
                                                                 "batch size": 20000,
          "alpha": 5,
                                                                 "alpha": 5,
          "batch_threads_num": 2,
                                                                 "batch threads num": 3,
                                                       23+
          "test_threads_num": 4,
                                                                 "test threads num": 12,
          "ordered": true,
                                                                 "ordered": true,
```

• 我们发现这两个文件对应训练的规模不同,mtranse_args_15K.json训练的batch_size比较小,所以对应的阈值也设置比较小;mtranse_args_100K.json训练的batch_size比较大,所以对应的阈值也设置比较大

2.3 什么是earlystop? 这个实例中为什么需要earlystop?

```
== should early stop ==

Training ends. Total time = 375.470 s.
accurate results: hits@[1, 5, 10, 50] = [29.714 51.076 60.562 77.457]%, mr = 241.629, mrr = 0.397836, time = 6.548 s
accurate results with csls: csls=10, hits@[1, 5, 10, 50] = [37.086 61.114 70.2 85.571]%
, mr = 95.185, mrr = 0.481600, time = 10.565 s
```

- earlystop指的是在跑完所有epoch前停止训练;
- 在实例中,由于为防止训练过拟合,当我们发现测试的准确率发生明显下降,我们应该停止迭代