Thread Labelling

April 16, 2022

1 Setup

```
[2]: import pandas as pd
 [3]: import pickle as pkl
[30]: import numpy as np
[20]: from tqdm import tqdm
        Load Data
 [4]: inverted = pkl.load(open('data/inverted_dict.pkl','rb'))
 [5]: type(inverted)
 [5]: dict
 [6]: inverted
 [6]: {'aatrox': 'aatrox',
       'atrox': 'aatrox',
       'ari': 'ahri',
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       'akali': 'akali',
       'ali': 'alistar',
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       'aurelion': 'aurelion sol',
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```

```
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```
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'twisted': 'twisted fate',
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```

```
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      'zoe': 'zoe',
      'zyra': 'zyra',
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      'glasc': 'renata glasc',
      'renataglasc': 'renata glasc',
      'renata': 'renata glasc',
      'zeri': 'zeri',
      'vex': 'vex',
      'akshan': 'akshan',
      'gwen': 'gwen',
      'viego': 'viego'}
[7]: df_comments = pd.read_csv('data/comments_dataframe.csv', index_col=[0])
[8]: df comments
[8]:
            submission_id comment_id \
     0
                   o00m44
                              h1si8vd
     1
                   o00m44
                              h1sil8e
     2
                   000m44
                              h1sigkk
     3
                   o00m44
                              h1sttyw
     4
                   o00m44
                              h1sqn3p
                   t3tx4z
     819317
                              hyuijui
     819318
                   t3tx4z
                             hyujigw
     819319
                   t3tx4z
                             hyujjc3
     819320
                   t3twyu
                             hyujgh3
     819321
                   t3twhr
                             hyuikvu
                                                    comment_text
     0
             Roam by having the wave pushed to enemy turret...
     1
             The first step to roaming is having good wave ...
     2
             Try not to roam when you think you won't get a ...
     3
                                           Roam less. farm more
     4
             1 roam kill is one missed wave. One missed wav...
     819317 Look in event viewer in windows to see what is...
     819318 Hi /u/-CrestiaBell. Thank you for participatin...
     819319 Im on a similar laptop with W11 and no problem...
     819320 Hi /u/DiabloDJ. Thank you for participating in...
     819321 Hi /u/NotARussian421. Thank you for participat...
     [819322 rows x 3 columns]
[9]: df_submissions = pd.read_csv('data/submissions_dataframe.csv',index_col=[0])
```

```
[10]: df_submissions
[10]:
                                id \
              created utc
                            o00m44
      0
               1623715013
      1
               1623714840
                            000k4w
      2
               1623714789
                            o00jk8
      3
               1623714743
                            o00j2e
      4
                            o00gyo
               1623714562
      143562
               1646093044
                           t3txtq
      143563
               1646092994
                           t3tx4z
      143564
               1646092983
                            t3twyu
      143565
               1646092952
                            t3twhr
      143566
               1646092817
                            t3tuqh
                                                            title \
      0
                                            I dont cs when im fed
              Totally planned prediction 2021 outplay that i...
      1
              UCAM Esports vs MAD Lions Madrid - LEAGUE OF L...
      2
      3
                             One hella lucky play on my le blanc
                                    A digital painting of Wolf!!
      4
                                                 The Double Steal
      143562
      143563
                                 Frequent crashes on Windows 11.
      143564
              Tarzaned leaving game after dying lvl 1, flame...
              Do not criticize russian aggression or Vladimi...
      143565
      143566
                                                 Lunar Revel Pass
                                                                         created \
                                                              url
      0
              https://www.reddit.com/r/leagueoflegends/comme...
                                                                 1.623740e+09
      1
                                 https://v.redd.it/iqthzskakb571
                                                                    1.623740e+09
              https://youtube.com/watch?v=wfHM4nX2z-A&fe...
      2
                                                                1.623740e+09
                                 https://v.redd.it/c9puqrqyjb571
      3
                                                                   1.623740e+09
                             https://i.redd.it/73ln16dhjb571.jpg
      4
                                                                   1.623740e+09
                                 https://v.redd.it/f11af9f4ynk81
      143562
                                                                   1.646118e+09
              https://www.reddit.com/r/leagueoflegends/comme...
      143563
                                                                 1.646118e+09
                                 https://v.redd.it/tpem6nm0ynk81
      143564
                                                                   1.646118e+09
              https://www.reddit.com/r/leagueoflegends/comme...
      143565
                                                                 1.646118e+09
      143566
              https://www.reddit.com/r/leagueoflegends/comme...
                                                                 1.646118e+09
                                                                               datetime
                                                               d_{-}
      0
              {'created_utc': 1623715013, 'id': 'o00m44', 't... 2021-06-14 23:56:53
      1
              {'created utc': 1623714840, 'id': 'o00k4w', 't... 2021-06-14 23:54:00
      2
              {'created_utc': 1623714789, 'id': 'o00jk8', 't... 2021-06-14 23:53:09
      3
              {'created_utc': 1623714743, 'id': 'o00j2e', 't... 2021-06-14 23:52:23
              {'created_utc': 1623714562, 'id': 'o00gyo', 't... 2021-06-14 23:49:22
      4
```

```
143562 {'created_utc': 1646093044, 'id': 't3txtq', 't... 2022-03-01 00:04:04
      143563 {'created_utc': 1646092994, 'id': 't3tx4z', 't... 2022-03-01 00:03:14
      143564 {'created_utc': 1646092983, 'id': 't3twyu', 't... 2022-03-01 00:03:03
      143565 {'created_utc': 1646092952, 'id': 't3twhr', 't... 2022-03-01 00:02:32
      143566 {'created_utc': 1646092817, 'id': 't3tuqh', 't... 2022-03-01 00:00:17
      [143567 rows x 7 columns]
        Wrangling
[11]: df_processing = df_comments.drop(columns=['comment_id'])
[12]: df_processing
             submission_id
[12]:
                                                                  comment_text
                    o00m44
                            Roam by having the wave pushed to enemy turret...
      1
                    o00m44
                            The first step to roaming is having good wave ...
      2
                    o00m44
                            Try not to roam when you think you won't get a ...
                    o00m44
      3
                                                          Roam less. farm more
      4
                    o00m44 1 roam kill is one missed wave. One missed wav...
                    t3tx4z Look in event viewer in windows to see what is...
      819317
      819318
                    t3tx4z Hi /u/-CrestiaBell. Thank you for participatin...
                    t3tx4z Im on a similar laptop with W11 and no problem...
      819319
      819320
                    t3twyu Hi /u/DiabloDJ. Thank you for participating in...
      819321
                    t3twhr Hi /u/NotARussian421. Thank you for participat...
      [819322 rows x 2 columns]
[13]: df_processing['comment_text'] = df_comments.
       →groupby('submission id')['comment text'].transform(lambda x: ' '.join(x))
      df_processing = df_processing[['submission_id','comment_text']].
       →drop_duplicates()
[14]: df_processing
[14]:
             submission_id
                                                                  comment_text
                    o00m44 Roam by having the wave pushed to enemy turret...
      10
                    o00j2e That Xerath is fucking lost LMFAO. that's not ...
      22
                    o00gbv Your thread has a disallowed title structure, ...
      23
                    o00c4g I think it's just bad luck man unless they are...
                    o00azn Remove feast\n\nRemove Olaf ult\n\nRemove tryn...
      27
```

t3u808 It's so interesting how low elo is so spiteful...

t3txtq i wish people would just pull drags out especi...

819304

819308

```
819317
                    t3tx4z Look in event viewer in windows to see what is...
      819320
                    t3twyu Hi /u/DiabloDJ. Thank you for participating in...
      819321
                    t3twhr Hi /u/NotARussian421. Thank you for participat...
      [87728 rows x 2 columns]
[15]: df processing = df processing.reset index(drop=True)
[16]: df_processing
[16]:
            submission_id
                                                                  comment_text
      0
                           Roam by having the wave pushed to enemy turret...
                   o00m44
      1
                   o00j2e That Xerath is fucking lost LMFAO. that's not ...
      2
                   o00gbv
                           Your thread has a disallowed title structure, ...
      3
                   o00c4g I think it's just bad luck man unless they are...
      4
                   o00azn Remove feast\n\nRemove Olaf ult\n\nRemove tryn...
      87723
                   t3u808 It's so interesting how low elo is so spiteful...
      87724
                   t3txtq i wish people would just pull drags out especi...
                   t3tx4z Look in event viewer in windows to see what is...
      87725
      87726
                   t3twyu Hi /u/DiabloDJ. Thank you for participating in...
      87727
                   t3twhr Hi /u/NotARussian421. Thank you for participat...
```

4 Labelling

[87728 rows x 2 columns]

```
[17]: champions list =
       _{\hookrightarrow}"Aatrox,Ahri,Akali,Alistar,Amumu,Anivia,Annie,Aphelios,Ashe,Aurelion_{\sqcup}
       →Sol, Azir, Bard, Blitzcrank, Brand, Braum, Caitlyn, Camille, Cassiopeia, Cho'Gath, Corki, Darius, Diana
       →Mundo, Draven, Ekko, Elise, Evelynn, Ezreal, Fiddlesticks, Fiora, Fizz, Galio, Gangplank, Garen, Gnar, G
       →IV, Jax, Jayce, Jhin, Jinx, Kai'Sa, Kalista, Karma, Karthus, Kassadin, Katarina, Kayle, Kayn, Kennen, Kha
       →Sin,Leona,Lillia,Lissandra,Lucian,Lulu,Lux,Malphite,Malzahar,Maokai,Master

¬Yi,Miss

       →Fortune, Mordekaiser, Morgana, Nami, Nasus, Nautilus, Neeko, Nidalee, Nocturne, Nunu
       →Willump, Olaf, Orianna, Ornn, Pantheon, Poppy, Pyke, Qiyana, Quinn, Rakan, Rammus, Rek'Sai, Rell, Renekt
       \hookrightarrow Kench, Taliyah, Talon, Taric, Teemo, Thresh, Tristana, Trundle, Tryndamere, Twisted
       →Fate, Twitch, Udyr, Urgot, Varus, Vayne, Veigar, Vel'Koz, Vi, Viktor, Vladimir, Volibear, Warwick, Wukon
       →Zhao, Yasuo, Yone, Yorick, Yuumi, Zac, Zed, Ziggs, Zilean, Zoe, Zyra"
      champions_list = champions_list.split(",")
      champions_list.append("Renata Glasc")
      champions_list.append("Zeri")
      champions_list.append("Vex")
      champions_list.append("Akshan")
```

```
champions_list.append("Viego")
      champions_list = [x.lower() for x in champions_list]
[19]: pkl.dump(champions_list, open('champions_list.pkl','wb'))
[21]: topic champions = list()
      for index, row in tqdm(df_processing.iterrows()):
          tokens = row['comment_text'].lower().split()
          counter_dict = {x : 0 for x in champions_list}
          for token in tokens:
              if token in inverted.keys():
                   counter_dict[inverted[token]] += 1
          champions = sorted(counter_dict.items(),
                              key = lambda x: x[1],
                              reverse = True)
          if len(champions) == 0:
              topic_champions.append(None)
          elif len(champions) == 1:
              topic_champions.append([champions[0][0]])
          elif champions[0][1] == champions[1][1]:
              topic_champions.append([champions[0][0], champions[1][0]])
          elif len(champions) \geq 3 and champions[0][1] == champions[1][1] and
       \rightarrow champions [2] [1]:
              topic_champions.append([champions[0][0], champions[1][0],__
       \hookrightarrow champions [2] [1]])
          else:
              topic_champions.append([champions[0][0]])
      df_processing['topic_champion'] = topic_champions
     87728it [00:08, 10878.39it/s]
[22]: df_processing
[22]:
            submission_id
                                                                  comment text \
      0
                   o00m44
                           Roam by having the wave pushed to enemy turret...
      1
                   o00j2e
                           That Xerath is fucking lost LMFAO. that's not ...
                           Your thread has a disallowed title structure, ...
      2
                   o00gbv
      3
                   o00c4g I think it's just bad luck man unless they are...
                   o00azn Remove feast\n\nRemove Olaf ult\n\nRemove tryn...
      87723
                   t3u808 It's so interesting how low elo is so spiteful...
```

champions_list.append("Gwen")

```
87724
                   t3txtq i wish people would just pull drags out especi...
      87725
                   t3tx4z Look in event viewer in windows to see what is...
                   t3twyu Hi /u/DiabloDJ. Thank you for participating in...
      87726
      87727
                   t3twhr Hi /u/NotARussian421. Thank you for participat...
                 topic_champion
                  [twisted fate]
      0
      1
                        [xerath]
      2
                  [aatrox, ahri]
      3
                  [aatrox, ahri]
      4
             [olaf, tryndamere]
                  [aatrox, ahri]
      87723
                 [jinx, kha'zix]
      87724
      87725
                  [aatrox, ahri]
                  [aatrox, ahri]
      87726
      87727
                  [aatrox, ahri]
      [87728 rows x 3 columns]
[23]: df_processing.to_csv('data/df_processing.csv')
```

Conversion to 1NF 5

```
[31]: lengths = list(map(len, df_processing['topic_champion'].values))
      df labels 1nf = pd.DataFrame(
          {'submission_id': np.repeat(df_processing['submission_id'], lengths),
           'topic_champion': np.concatenate(df_processing['topic_champion'].values)
          }
      )
```

```
[32]: df_labels_1nf
```

```
[32]:
             submission_id topic_champion
                    o00m44
                              twisted fate
      1
                    o00j2e
                                    xerath
      2
                    o00gbv
                                    aatrox
      2
                    o00gbv
                                      ahri
      3
                    o00c4g
                                    aatrox
                    t3tx4z
      87725
                                      ahri
      87726
                    t3twyu
                                    aatrox
      87726
                    t3twyu
                                      ahri
      87727
                    t3twhr
                                    aatrox
      87727
                    t3twhr
                                      ahri
```

```
[148662 rows x 2 columns]
```

[33]: df_labels_1nf.to_csv('data/df_labels_1nf.csv')