```
In [42]: import pymongo
         import pandas as pd
         import numpy as np
         from pymongo import MongoClient
         from bson.objectid import ObjectId
         import datetime
         import matplotlib.pyplot as plt
         from collections import defaultdict
         %matplotlib inline
         import json
         plt.style.use('ggplot')
         import seaborn as sns
         from math import log10, floor
         from time import time
         from sklearn.feature extraction.text import TfidfVectorizer, CountVectorizer
         from sklearn.cluster import KMeans, MiniBatchKMeans
         from IPython.display import Image
         from IPython.core.display import HTML
         import matplotlib.pyplot as plt
         import urllib.request
```

```
In [2]: ## Connect to local DB

client = MongoClient('localhost', 27017)
print ("Setup db access")
#
# Get collections from mongodb
#

db = client.test
```

Setup db access

```
In [3]: # Find all qual_id's
   qual_ids = db.anon_student_task_responses.distinct('qual_id')
```

```
In [4]: # print (len(qual_ids), qual_ids)
```

```
In [6]: qual_id_counts = list(qual_id_counts)
```

```
In [7]: qual_count_df = pd.DataFrame(qual_id_counts)
```

```
In [8]: print (qual_id_counts)
        parta.nWzbkwqg88'}, 'count': 1}, {'_id': {'qual_id': 'FIohvCCngW.parta.2t
        VCSx9xM8'}, 'count': 1}, {'_id': {'qual_id': 'FIohvCCngW.parta.ItYOZ2Mjp
        Q'}, 'count': 2}, {'_id': {'qual_id': 's4FlyZcPsQ.partb.o-MyTL6oib'}, 'co
        unt': 1}, {' id': {'qual id': ' tmH4Wd7lx.parta.jeTlRzUVMR'}, 'count':
        1}, {' id': {'qual id': 'gmKAbYVHOE.parta.NpBAHXqo-F'}, 'count': 1}, {' i
        d': {'qual id': 'XXf--mNIjj.bonus.KreK2R1-39'}, 'count': 2}, {' id': {'qu
        al_id': 'BbI26g5ijL.parta.mUHMxGVWEl'}, 'count': 1}, {'_id': {'qual_id':
        '9WPxMoBH0F.partb.wZ9tufnRk2'}, 'count': 1}, {' id': {'qual id': 't-ap-GH
        wCR.parta.M__BWubi4G'}, 'count': 2}, {'_id': {'qual_id': 'LaYmTaiTJk.part
        a.eKIQc4Pqjb'}, 'count': 2}, {'_id': {'qual_id': 'LaYmTaiTJk.parta.gp0JAU
        tPZp'}, 'count': 2}, {' id': {'qual id': '0KWOKTSei4.parta.7RIMJh0rgu'},
        'count': 1}, {'_id': {'qual_id': 'OKWOKTSei4.parta.RBIPf6TRR1'}, 'count':
        1}, {' id': {'qual id': 'WX- diOA5G.bonus.Ssebz350BT'}, 'count': 2}, {' i
        d': {'qual_id': '_tmH4Wd7lx.parta._XfGApTKXY'}, 'count': 1}, {'_id': {'qu
        al_id': 'YeWlpi-yG4.partb.aaCQpy9mtp'}, 'count': 1}, {' id': {'qual id':
        'OH_kgnaQCv.partb.xSwz6sE5jI'}, 'count': 1}, {'_id': {'qual_id': 't-ap-GH
        wCR.parta.8eKgTmtsE2'}, 'count': 2}, {'_id': {'qual_id': 'LaYmTaiTJk.part
        a.zlnwPzNTF-'}, 'count': 2}, {'_id': {'qual_id': 'WX-_diOA5G.bonus.Kte5Ue
        NUMq'}, 'count': 1}, {'_id': {'qual_id': 'Xtl-tj5BjN.parta.Y3uzBWB8V6'},
```

```
In [9]: print (qual count df)
```

```
count
                                                         id
0
               { 'qual id': 'FIohvCCngW.parta.DNtNNfEZ76'}
                                                                  1
1
                                                                 2
              {'qual id': '6UUZK1Xn5t.partb.6bJn3sN7V1'}
2
               {'qual_id': 't-ap-GHwCR.parta.7JzRWxuPIR'}
                                                                 1
3
               { 'qual id': 'FIohvCCngW.parta.dMo4-unXed' }
                                                                 1
4
               { 'qual_id': 'FIohvCCngW.parta.nWzbkwqg88'}
                                                                 1
5
              {'qual_id': 'FIohvCCngW.parta.2tVCSx9xM8'}
                                                                 1
6
                                                                 2
               {'qual id': 'FIohvCCngW.parta.ItYOZ2MjpQ'}
7
               {'qual id': 's4FlyZcPsQ.partb.o-MyTL6oib'}
                                                                 1
8
               {'qual_id': '_tmH4Wd7lx.parta.jeTlRzUVMR'}
                                                                 1
9
               { 'qual id': 'gmKAbYVHOE.parta.NpBAHXqo-F'}
                                                                 1
                                                                 2
10
               {'qual_id': 'XXf--mNIjj.bonus.KreK2R1-39'}
11
              {'qual_id': 'BbI26g5ijL.parta.mUHMxGVWE1'}
                                                                 1
12
               {'qual id': '9WPxMoBH0F.partb.wZ9tufnRk2'}
                                                                 1
                                                                 2
13
               {'qual id': 't-ap-GHwCR.parta.M BWubi4G'}
14
               { 'qual id': 'LaYmTaiTJk.parta.eKIQc4Pqjb'}
                                                                 2
15
              {'qual id': 'LaYmTaiTJk.parta.gp0JAUtPZp'}
                                                                 2
                                                                 1
16
               {'qual_id': '0KWOKTSei4.parta.7RIMJh0rgu'}
17
               { 'qual_id': '0KWOKTSei4.parta.RBIPf6TRR1'}
                                                                 1
               {'qual id': 'WX- diOA5G.bonus.Ssebz350BT'}
                                                                 2
18
               {'qual id': ' tmH4Wd7lx.parta. XfGApTKXY'}
19
                                                                 1
20
               {'qual_id': 'YeWlpi-yG4.partb.aaCQpy9mtp'}
                                                                 1
21
               {'qual_id': 'OH_kgnaQCv.partb.xSwz6sE5jI'}
                                                                 1
22
               {'qual id': 't-ap-GHwCR.parta.8eKgTmtsE2'}
                                                                 2
23
               { 'qual_id': 'LaYmTaiTJk.parta.zlnwPzNTF-'}
                                                                 2
24
               {'qual id': 'WX- diOA5G.bonus.Kte5UeNUMq'}
                                                                 1
25
               {'qual id': 'Xtl-tj5BjN.parta.Y3uzBWB8V6'}
                                                                 1
26
               { 'qual id': 't-ap-GHwCR.parta.JJdbSBd0AR' }
                                                                 2
27
               {'qual id': 'WX- diOA5G.bonus.Wwn7gHV2bO'}
                                                                 1
28
               {'qual id': 'BbI26g5ijL.parta.ESSbf2Pb8s'}
                                                                 2
29
               {'qual id': 'V1KViWeAJV.parta.zo -fljLhE'}
                                                                 1
                                                                . . .
       {'qual id': '5ao6mIeuIN.lesson49 3 partb.008Yc...
27443
                                                                68
               {'qual id': 'wnw-ntqg a.partb.x xKf6k-i1'}
27444
                                                               197
27445
               { 'qual id': 'k3AXRA4BRE.bonus.0aKPdbdQVI'}
                                                                54
               { 'qual id': 'R9jkzw2-4Q.parta.J1 0UU9q7 '}
27446
                                                                31
27447
               {'qual id': 'WAAn8yEcZJ.parta.rru6gbdBp8'}
                                                              1631
27448
              {'qual id': 'gKph6LE7HV.parta.0glFhFJYTu'}
                                                               200
               {'qual id': 'YeWlpi-yG4.partb.zYwO07dVwx'}
27449
                                                                 6
27450
               {'qual id': 'tCFoIXfgqi.parta.7mY2YAOJJF'}
                                                              1397
               { 'qual id': 'o9IqlN1J-z.parta.TkWwnXbt0m' }
                                                                38
27451
27452
               {'qual id': 'pefFtJ 8oa.parta.ODpjnMmFv0'}
                                                               143
27453
              {'qual id': 'yyU0jsjXFO.partb.PUaC os7tW'}
                                                              1408
27454
              {'qual id': 'DebcfZEEmI.partb.OEH-1W96yD'}
                                                               353
               {'qual id': 'XSZNVMzN3n.parta.14fTgjyOtN'}
                                                               927
27455
27456
                {'qual id': 'ybQjHvfg2c.set1.EEFYXMRQPW'}
                                                               145
27457
               {'qual id': ' qty2dzfaI.parta.d7AyKSF MU'}
                                                               214
              {'qual_id': 'eSc-FB1B_F.partb.jxWKgZXIHs'}
27458
                                                               149
27459
               {'qual id': 'yyU0jsjXFO.partb.UVkc5L9NL4'}
                                                               557
27460
               {'qual id': '8sg0e0824Q.partb.yBNi-sgRi '}
                                                              1284
                {'qual id': 'lkqzXK4iws.set3.vRo00L1mzS'}
27461
                                                               710
              {'qual id': 'Px5HtjZhgK.upto4.jKNtagBLhQ'}
27462
                                                               611
27463
               {'qual id': '5qwW IZJIz.partb.b8pt2hwGU3'}
                                                               143
27464
               {'qual_id': 'nqu33m8PC3.parta.RQXLZIobgv'}
                                                                18
27465
               {'qual id': 'qIkkuC4fAD.partb.q2ElZZuy7P'}
                                                              1254
```

```
{'qual_id': 'nzaa6a-Zxk.set1.WoGN68L-Db'}
27466
                                                              267
              {'qual_id': '3GL2qzMC_-.parta.5g1mHAXKlZ'}
27467
                                                               14
27468
              {'qual_id': 'b20XBQ-K-L.parta.kB43K70eYa'}
                                                               94
27469
               {'qual_id': 'ybQjHvfg2c.set1.ve0p35JAft'}
                                                              155
27470
              {'qual_id': 'tByvyB314w.parta.rURuwd0Q0j'}
                                                              119
27471
              {'qual_id': '6UUZK1Xn5t.partb.OC_TNthd-b'}
                                                                7
              {'qual_id': 'qQZqA6CaO_.parta.OOJ2IGN5Jn'}
27472
                                                             1688
[27473 rows x 2 columns]
```

```
In [10]: qual_count_df = qual_count_df.sort_values(by='count', ascending=False)
```

```
In [11]: qual_count_df.reset_index(drop=True,inplace=True)
    print (qual_count_df)
```

```
id
                                                            count
0
             {'qual id': 'xSDXuo9OEH.bonus.OG XxtbnEa'}
                                                            22752
1
             {'qual id': 'YN4n4X5GRF.bonus.Q5XY-9tBFu'}
                                                            19100
2
             {'qual id':
                         '9wRCzK1G7F.partb.12d Yq8M01'}
                                                            18911
3
             {'qual_id': 'TJxldqZMXd.partb.gqJqOrIhu_'}
                                                            18390
4
             {'qual_id':
                          'TJxldqZMXd.partb.9L_iTwGd5z'}
                                                            18197
5
             {'qual id': 'TJxldqZMXd.partb.W2tLvQTbkI'}
                                                            17800
6
             {'qual id': '9wRCzK1G7F.partb.SHkv5F Yzi'}
                                                            17466
7
                         'TJxldqZMXd.partb.hxSleqLik1'}
             {'qual id':
                                                            17191
8
             {'qual id': '9wRCzK1G7F.partb.qGGEQyiE j'}
                                                            17007
9
             {'qual id':
                         'kvig7fcCVc.partb.3y7UMHuR_i'}
                                                            16876
10
             {'qual_id': 'kvig7fcCVc.partb.1jPc7UeCZc'}
                                                            16552
11
             {'qual id': '9wRCzK1G7F.partb.dHZqaGepfV'}
                                                            16444
12
             {'qual id': 'trDQgmx9g.bonus.S2xjdLDOgA'}
                                                            15948
13
             {'qual id':
                          'UlJYoQjOUR.parta.byIwJMROwV'}
                                                            15944
14
             {'qual id':
                         'HaXmMUnltl.bonus.WB6U9OhvZi'}
                                                            14952
15
             {'qual id':
                         '9wRCzK1G7F.partb.75ayW9Wz4k'}
                                                            14780
16
             {'qual_id':
                          'kvig7fcCVc.partb.ZKOrrM1K8G'}
                                                            14700
17
             {'qual id':
                         'kvig7fcCVc.partb.eZe6HdH_r_'}
                                                            14496
18
             {'qual id':
                          'pD 1459mfy.partb.aL Gvm9q0h'}
                                                            14183
19
             {'qual id':
                         'pD_1459mfy.partb.v9XdqzVk22'}
                                                            13823
20
             {'qual_id': '_dlqnEqMYs.partb.TIL71Bb5gj'}
                                                            13655
21
             {'qual_id': 'UlJYoQjOUR.partb.ER0z0eSNUG'}
                                                            13516
22
             {'qual id':
                         'kvig7fcCVc.partb.GZo13HUAxn'}
                                                            13372
23
             {'qual id':
                          '9wRCzK1G7F.parta.NxWueNsFnx'}
                                                            13226
24
             {'qual id': 'pD 1459mfy.partb.pMk-moD0f8'}
                                                            13224
25
             {'qual id': 'FmeMEBRHmB.bonus.24M2DNktUG'}
                                                            13162
26
             {'qual id': '9wRCzK1G7F.partb.WsTATD5a-k'}
                                                            12944
27
             {'qual id': 'kvig7fcCVc.partb.Re5yQZp9Kb'}
                                                            12917
28
             {'qual id': 'Syxag5tFow.parta.kg0JZgPiTI'}
                                                            12712
29
             {'qual id': 'jun0JnZOzp.partb.C4W9cb9ifk'}
                                                            12609
. . .
                                                              . . .
             {'qual id': 'IRaIcmaWjs.mixed.9Vly1eE0fq'}
27443
                                                                1
            {'qual id': 'urBaXsHphv.proper.NrOjfHAbe9'}
                                                                1
27444
27445
             {'qual id': 'gmKAbYVHOE.parta.7jd2dUX-Qs'}
                                                                1
             {'qual id': 'V1KViWeAJV.parta.C9IQitcJkl'}
                                                                1
27446
27447
             {'qual id': 'Tnk5i6prKY.bonus.ylLVgY7qyL'}
                                                                1
             {'qual id': 'V1KViWeAJV.parta.Pf2RmIt38D'}
                                                                1
27448
27449
             {'qual id': 'wnw-ntqg a.parta. BxnPUM3qM'}
                                                                1
              { 'qual id': '0gf4NuFCTT.set1.NxDTv 0mSj'}
                                                                1
27450
             {'qual_id': 'Ok-iIHxjgx.parta.htJSpwpdhh'}
27451
                                                                1
27452
             {'qual_id': '29LJstkION.parta._qnd1tTA5U'}
                                                                1
27453
              {'qual id': '4aSCnZqs4n.set1.bgvtAG5jSW'}
                                                                1
              { 'qual id': 'fymYH3DPol.set1.Z a6mXZZDv'}
                                                                1
27454
             {'qual id': 'YCnJ90d2QG.partb.cu 0oWx9dD'}
27455
                                                                1
27456
             {'qual_id': 'odlsWXcSI3.mixed.Xp5uQelqoi'}
                                                                1
27457
              {'qual id': 'NSyM52y-Qs.set1.zBeoiqV6mp'}
                                                                1
27458
             {'qual id': 's4FlyZcPsQ.partb.vLlTmkdU9L'}
                                                                1
27459
             {'qual id': 'odlsWXcSI3.mixed.8Wd40C45Wm'}
                                                                1
27460
             {'qual id': 'odlsWXcSI3.mixed.0kwsuDMxRT'}
                                                                1
         {'qual_id': 'fymYH3DPol.set_only0.5kMYtKqt76'}
27461
                                                                1
27462
       {'qual id': 't8suuCs7vN.131 9 parta.BzNjoMcAuz'}
                                                                1
27463
              {'qual_id': 'fymYH3DPol.set3.zwLDPIr1id'}
                                                                1
27464
             {'qual id': '5qwW IZJIz.partb.gnqbsSvSGO'}
                                                                1
```

```
{'qual id': 'IRaIcmaWjs.mixed.lirhw9gRRO'}
         27465
                                                                         1
                       {'qual_id': 'IRaIcmaWjs.mixed.cs89mRLCPy'}
         27466
                                                                         1
         27467
                        {'qual_id': 'WB5Xk0YdVb.set1.ZnTK62pyFE'}
                                                                         1
                        {'qual_id': 'pufURj5P3q.set4.1zWmpGhqBt'}
         27468
                                                                         1
                       {'qual_id': 'iMCBGBUqlz.parta.5PTg4vE64J'}
         27469
                                                                         1
         27470
                       {'qual_id': 'OvOBbA00aZ.partb.OTqwARekNs'}
                                                                         1
                             {'qual_id': 'IVHhngfbBS.W2jt9mZsDQ'}
         27471
                                                                         1
                       { 'qual id': 'FIohvCCngW.parta.DNtNNfEZ76'}
                                                                         1
         27472
         [27473 rows x 2 columns]
In [12]:
         qual id fail counts = db.anon_student_task_responses.aggregate(
           [ {
              '$group': {
                 _id': {
                  'qual_id': '$qual_id',
                  'correct': 'False'
                },
                'count': {
                  '$sum': 1
             }
           }
            ]
In [13]: qual_id_fail_counts = list(qual_id_fail_counts)
In [14]:
         qual_fail_count_df = pd.DataFrame(qual_id_fail_counts)
         qual_fail_count_df.sort_values(by='count', inplace=True, ascending=False)
In [15]:
```

In [16]: qual\_fail\_count\_df

Out[16]:

	id	count
045=6	_id	count
21573	{'qual_id': 'xSDXuo9OEH.bonus.OG_XxtbnEa', 'co	22752
19385	{'qual_id': 'YN4n4X5GRF.bonus.Q5XY-9tBFu', 'co	19100
23535	{'qual_id': '9wRCzK1G7F.partb.12d_Yq8M01', 'co	18911
26681	{'qual_id': 'TJxldqZMXd.partb.gqJqOrlhu_', 'co	18390
27443	{'qual_id': 'TJxldqZMXd.partb.9L_iTwGd5z', 'co	18197
27438	{'qual_id': 'TJxldqZMXd.partb.W2tLvQTbkl', 'co	17800
27109	{'qual_id': '9wRCzK1G7F.partb.SHkv5F_Yzi', 'co	17466
25049	{'qual_id': 'TJxldqZMXd.partb.hxS1eqLik1', 'co	17191
6599	{'qual_id': '9wRCzK1G7F.partb.qGGEQyiE_j', 'co	17007
26565	{'qual_id': 'kvig7fcCVc.partb.3y7UMHuR_i', 'co	16876
20581	{'qual_id': 'kvig7fcCVc.partb.1jPc7UeCZc', 'co	16552
11318	{'qual_id': '9wRCzK1G7F.partb.dHZqaGepfV', 'co	16444
22319	{'qual_id': '_trDQgmx9g.bonus.S2xjdLDOgA', 'co	15948
4544	{'qual_id': 'UlJYoQjOUR.parta.bylwJMROwV', 'co	15944
27452	{'qual_id': 'HaXmMUnltl.bonus.WB6U9OhvZi', 'co	14952
11057	{'qual_id': '9wRCzK1G7F.partb.75ayW9Wz4k', 'co	14780
14879	{'qual_id': 'kvig7fcCVc.partb.ZKOrrM1K8G', 'co	14700
26414	{'qual_id': 'kvig7fcCVc.partb.eZe6HdH_r_', 'co	14496
16838	{'qual_id': 'pD_1459mfy.partb.aL_Gvm9q0h', 'co	14183
24419	{'qual_id': 'pD_1459mfy.partb.v9XdqzVk22', 'co	13823
16304	{'qual_id': '_d1qnEqMYs.partb.TIL71Bb5gj', 'co	13655
22317	{'qual_id': 'UlJYoQjOUR.partb.ER0z0eSNUG', 'co	13516
13057	{'qual_id': 'kvig7fcCVc.partb.GZo13HUAxn', 'co	13372
26867	{'qual_id': '9wRCzK1G7F.parta.NxWueNsFnx', 'co	13226
18710	{'qual_id': 'pD_1459mfy.partb.pMk-moD0f8', 'co	13224
23450	{'qual_id': 'FmeMEBRHmB.bonus.24M2DNktUG', 'co	13162
25907	{'qual_id': '9wRCzK1G7F.partb.WsTATD5a-k', 'co	12944
27010	{'qual_id': 'kvig7fcCVc.partb.Re5yQZp9Kb', 'co	12917
22853	{'qual_id': 'Syxag5tFow.parta.kg0JZgPiTI', 'co	12712
24751	{'qual_id': 'jun0JnZOzp.partb.C4W9cb9ifk', 'co	12609

	id	count
5048	{'qual_id': 'WXdiOA5G.bonus.zEp-rGNtdX', 'co	1
5046	{'qual_id': 'Ndgh-LYI_Q.set1.1g8LX2TN4w', 'cor	1
26166	{'qual_id': 'b0xB7OeH8I.FVauNPrvYs', 'correct'	1
5258	{'qual_id': 'fymYH3DPol.set_only1.wlKynEe_N-',	1
5260	{'qual_id': 'fymYH3DPol.set3.ksoZkHlasR', 'cor	1
5349	{'qual_id': 'Ok-ilHxjgx.parta.6A7Qm1iOLM', 'co	1
5313	{'qual_id': 'pufURj5P3q.set1.7rvnF-BYuz', 'cor	1
1582	{'qual_id': 's4FlyZcPsQ.partb.VzKoP3g3dQ', 'co	1
5333	{'qual_id': 'MwmQMh2Sc3.set1.qJKrXMMMj6', 'cor	1
1588	{'qual_id': 'eSc-FB1B_F.partb.pAaUs_F73h', 'co	1
5330	{'qual_id': 'UlJYoQjOUR.part_b.0eNYNvcMeG', 'c	1
24493	{'qual_id': 'fymYH3DPol.set1.Gy-T-xpeeV', 'cor	1
5316	{'qual_id': 'pufURj5P3q.set1.pmpl-eKzE2', 'cor	1
24497	{'qual_id': '41wwVr8j3l.set1.x2xHmCD1-6', 'cor	1
24498	{'qual_id': 'tO12cxwkdc.parta.gQtLl8z7lO', 'co	1
1600	{'qual_id': 'FlohvCCngW.parta.W3jfrRubzK', 'co	1
5314	{'qual_id': 'pufURj5P3q.set1.a0yHJ5AjQt', 'cor	1
5304	{'qual_id': 'EDkkwkoA5r.set3.rgGpNAo_em', 'cor	1
5265	{'qual_id': 'W_6v_cGOhW.set1.3P2rJoW2eA', 'cor	1
26215	{'qual_id': 't-ap-GHwCR.partaozJpHJct1', 'co	1
5303	{'qual_id': '6nBHKepQ3Y.set1.arNOdx0Sj7', 'cor	1
5293	{'qual_id': 'xXRLpqHt26.set1.3J89hyh93P', 'cor	1
5292	{'qual_id': 'EDkkwkoA5r.set_only0.4Gim1vhClk',	1
5289	{'qual_id': 'EDkkwkoA5r.set_only1.27VvpfdE5P',	1
5288	{'qual_id': 'EDkkwkoA5r.set3.r497JyL9tN', 'cor	1
26201	{'qual_id': 'Xtl-tj5BjN.parta.DM_xcJ97p6', 'co	1
5283	{'qual_id': 'EDkkwkoA5r.set3.7e3w4zJaK1', 'cor	1
1641	{'qual_id': 'urBaXsHphv.proper.NrOjfHAbe9', 'c	1
24526	{'qual_id': 'YBMMW3pDYs.bonus.WUxb3U-EcO', 'co	1
0	{'qual_id': 'FlohvCCngW.parta.DNtNNfEZ76', 'co	1

27473 rows × 2 columns

```
In [17]: ## Functions for turning dictionary into document
          def make_string_from_list(key, elem_list):
              # Append key to each item in list
              ans = ''
              for elem in elem list:
                  ans += key + '_' + elem
         def make string(elem, key=None, top=True):
              ans = ''
              if not elem:
                  return ans
              if top:
                  top = False
                  top_keys = []
                  for idx in range(len(elem.keys())):
                      top_keys.append(True)
              for idx, key in enumerate(elem.keys()):
                  if top_keys[idx]:
                      top = True
                      top_keys[idx] = False
                      ans += ' '
                  else:
                      top = False
                  \#print ('ans = ', ans)
                  #print (type(elem[key]))
                  if type(elem[key]) is str or\
                          type(elem[key]) is int:
                      #print ('add value', elem[key])
                      value = str(elem[key])
                      #ans += key + '_' + value + ' ' + value + ' '
ans += key + '_' + value + ' '
                  elif type(elem[key]) is list:
                      #print ('add list', elem[key])
                      temp elem = dict()
                      for item in elem[key]:
                          temp elem[key] = item
                          ans += make string(temp elem, top)
                  elif type(elem[key]) is dict:
                      #print ('add dict', elem[key])
                      for item key in elem[key].keys():
                          temp elem = dict()
                          temp_elem[item_key] = elem[key][item_key]
                          ans += key + '_' + make_string(temp_elem, top)
                  elif type(elem[key]) is float:
                      #print ('add dict', elem[key])
                      sig = 2
                      value = elem[key]
                      value = round(value, sig-int(
                      floor(log10(abs(value))))-1)
                      value = str(value)
```

```
#ans += key + '_' + value + ' ' + value + ' '
ans += key + '_' + value + ' '
# ans += ' ' + key + ' '
#print ('not handled', elem[key])
return ans
```

```
In [18]: def make_doc_data_set(prob_set):
    df3 = pd.DataFrame(list(prob_set))
    df3['response_doc'] = df3['response'].map(make_string)
    df3['response_doc'] = df3['response_doc'].map(lambda x: x + ' ')
    df3['response_doc'] = df3['response_doc'].map(lambda x: x.replace('/','_df3['response_doc'] = df3['response_doc'] + ' ' + df3['txt']
    df3['response_doc'] = df3['response_doc'].map(lambda x: x.replace("\n", df3['response_doc'] = df3['response_doc'].map(lambda x: x.replace("\n", df3['response_doc'] = df3['response_doc'].map(lambda x: x.replace("?", 'return df3)
```

```
In [19]:
         def make k means(data samples, n features=200, n topic=30, n top words=10, d
             n samples = len(data samples)
             print("Extracting tf-idf features ...")
             tfidf vectorizer = TfidfVectorizer(max df=0.95, min df=2,
                                                 max features=n features,
                                                 stop words='english')
             t0 = time()
             tfidf = tfidf vectorizer.fit transform(data samples)
             print("done in %0.3fs." % (time() - t0))
             # Number of clusters
             true k = clusters
             km = MiniBatchKMeans(n_clusters=true_k, init='k-means++', n init=1,
                                       init size=1000, batch size=1000, random state=4
             print("Clustering with %s" % km)
             t0 = time()
             km.fit(tfidf)
             print("done in %0.3fs" % (time() - t0))
             return km
```

```
In [20]: top_ten_qual_id = qual_count_df[:10]
In [21]: this qid = top ten qual id.iloc[0][' id']['qual id']
```

In [22]: top\_ten\_qual\_id

Out[22]:

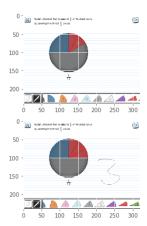
	_id	count
0	{'qual_id': 'xSDXuo9OEH.bonus.OG_XxtbnEa'}	22752
1	{'qual_id': 'YN4n4X5GRF.bonus.Q5XY-9tBFu'}	19100
2	{'qual_id': '9wRCzK1G7F.partb.12d_Yq8M01'}	18911
3	{'qual_id': 'TJxldqZMXd.partb.gqJqOrlhu_'}	18390
4	{'qual_id': 'TJxldqZMXd.partb.9L_iTwGd5z'}	18197
5	{'qual_id': 'TJxldqZMXd.partb.W2tLvQTbkl'}	17800
6	{'qual_id': '9wRCzK1G7F.partb.SHkv5F_Yzi'}	17466
7	{'qual_id': 'TJxldqZMXd.partb.hxS1eqLik1'}	17191
8	{'qual_id': '9wRCzK1G7F.partb.qGGEQyiE_j'}	17007
9	{'qual_id': 'kvig7fcCVc.partb.3y7UMHuR_i'}	16876

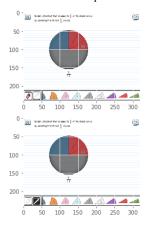
In [47]: | df\_top\_ten = []

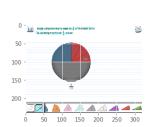
```
In [49]: for row in range(len(top_ten_qual_id)):
             # print (top ten qual id.iloc[row][' id']['qual id'], top ten qual id.il
             this qid = top_ten_qual_id.iloc[row]['_id']['qual_id']
             count = top_ten_qual_id.iloc[row]['count']
             print ('Analysis {0} for qual_id {1} with {2} samples'.format(row, this_
             prob_set = db.anon_student_task_responses.find({'qual_id':this_qid, 'col
             df3 = make_doc_data_set(prob_set)
             print ('Session 0 txt ', df3.iloc[0]['txt'])
             df_top_ten.append(df3.copy())
             data_samples = df3['response_doc']
             km = make k means(data samples, clusters=10)
             df3['cluster'] = km.labels_
             print ('qual_id {0} has these clusters'.format(this_qid))
             print (df3['cluster'].value_counts())
             columns = 4
             num images = 8
             # Look at top four clusters
             # Print
             for cluster in (df3['cluster'].value_counts().keys())[:4]:
                 plt.figure(figsize=(20,10))
                 print ('Cluster', cluster )
                 cluster data = df3[df3['cluster']==cluster]
                 #print (cluster data[:10])
                 images = []
                 for idx in range(min(num images, df3['cluster'].value counts()[clust
                           images.append(Image(cluster data.iloc[idx]['screenshot url
                     # create a file-like object from the url
                     print (cluster_data.iloc[idx]['screenshot_url'])
                     try:
                          f = urllib.request.urlopen(cluster data.iloc[idx]['screenshe
                     except:
                         print(' could not read {0}'.format(cluster data.iloc[idx]['s
                         continue
                     # read the image file in a numpy array
                     a = plt.imread(f)
                     #plt.imshow(a)
                     #plt.show()
                     #print(image)
                     #display(image)
                     plt.subplot(min(9, df3['cluster'].value_counts()[cluster]) / col
                     plt.imshow(a)
                 plt.show()
```

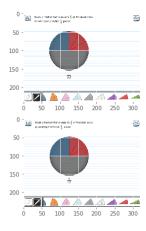
Analysis 0 for qual\_id xSDXuo9OEH.bonus.OG\_XxtbnEa with 22752 samples Session 0 txt Model a fraction that is equal to 1/4 of the black circl

```
e
by covering it with red 1/12 pieces.
Answer: [object Object]
Extracting tf-idf features ...
done in 1.526s.
Clustering with MiniBatchKMeans(batch_size=1000, compute_labels=True, ini
t='k-means++',
        init size=1000, max iter=100, max no improvement=10, n clusters=1
0,
        n init=1, random state=42, reassignment ratio=0.01, tol=0.0,
        verbose=0)
done in 0.054s
qual id xSDXuo90EH.bonus.OG XxtbnEa has these clusters
1
     2091
     1538
3
0
     1530
2
     1271
5
     1231
8
     1038
9
      938
7
      825
      383
Name: cluster, dtype: int64
Cluster 4
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ng (http://woot math cub.s3.amazonaws.com/ss/74237/OG XxtbnEa.14706334184
84.png)
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53.png)
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a.1470767152263.png (http://woot math cub.s3.amazonaws.com/ss/74649/OG Xx
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78.png)
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ng (http://woot math cub.s3.amazonaws.com/ss/74225/OG XxtbnEa.14713361790
81.png)
```









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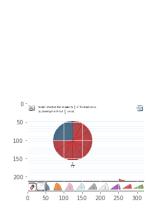
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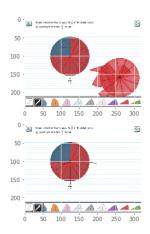
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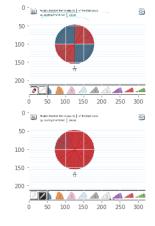
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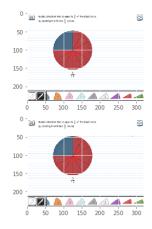
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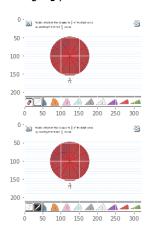
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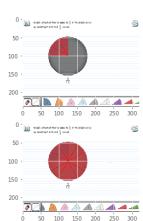
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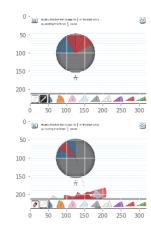
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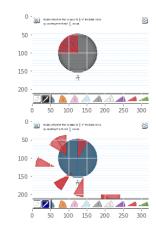
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# Cluster 0

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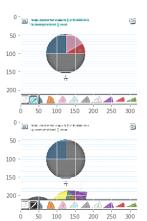
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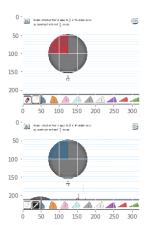
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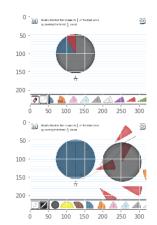
03.png)

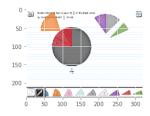
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tbnEa.1472753115057.png)









Analysis 1 for qual\_id YN4n4X5GRF.bonus.Q5XY-9tBFu with 19100 samples Session 0 txt Model a fraction that is equal to 1/2 using the one twelft h red pieces.

Answer: [object Object]

Extracting tf-idf features ...

done in 0.945s.

Clustering with MiniBatchKMeans(batch\_size=1000, compute\_labels=True, ini
t='k-means++',

init\_size=1000, max\_iter=100, max\_no\_improvement=10, n\_clusters=1
0,

n\_init=1, random\_state=42, reassignment\_ratio=0.01, tol=0.0,
verbose=0)

done in 0.046s

qual id YN4n4X5GRF.bonus.Q5XY-9tBFu has these clusters

- 6 991
- 2 830
- 7 672
- 9 634
- 8 579
- 3 555
- 4 303
- 1 250
- 5 177
- 0 76

Name: cluster, dtype: int64

Cluster 6

http://woot\_math\_cub.s3.amazonaws.com/ss/74237/Q5XY-9tBFu.1470633048978.p ng (http://woot\_math\_cub.s3.amazonaws.com/ss/74237/Q5XY-9tBFu.1470633048978.png)

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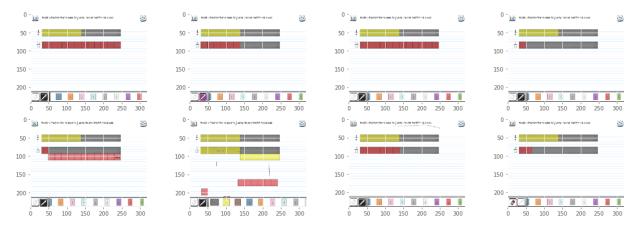
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# Cluster 2

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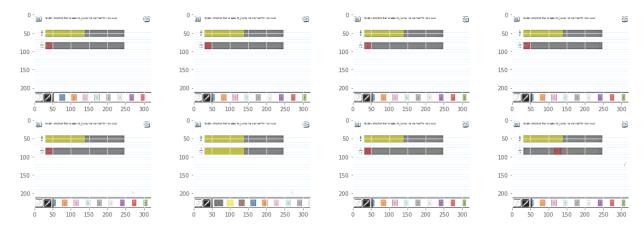
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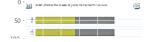
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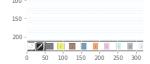
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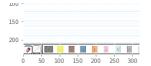
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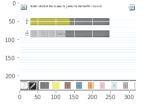
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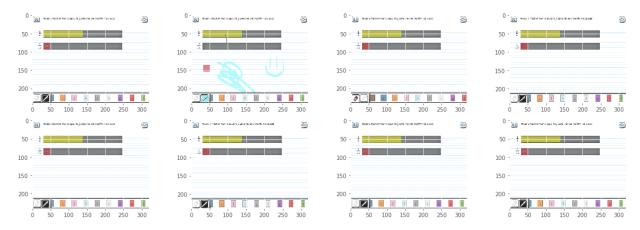
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Analysis 2 for qual\_id 9wRCzK1G7F.partb.12d\_Yq8M01 with 18911 samples Session 0 txt The brown is the whole unit. Which of these pieces is one third of the brown piece?

Drag the piece to the answer box.

Answer: 1/9

Extracting tf-idf features ...

done in 0.367s.

Clustering with MiniBatchKMeans(batch\_size=1000, compute\_labels=True, ini

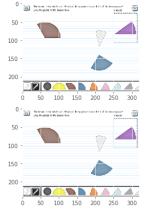
```
t= \kappa-means++ ,
        init size=1000, max iter=100, max no improvement=10, n clusters=1
0,
        n_init=1, random_state=42, reassignment ratio=0.01, tol=0.0,
        verbose=0)
done in 0.080s
qual id 9wRCzK1G7F.partb.12d Yq8M01 has these clusters
3
      796
0
      697
4
      509
5
      467
      313
1
2
      283
7
      233
9
      201
8
       33
Name: cluster, dtype: int64
Cluster 6
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ng (http://woot math cub.s3.amazonaws.com/ss/74320/12d Yg8M01.14702985161
94.png)
http://woot math cub.s3.amazonaws.com/ss/74703/12d Yq8M01.1472220509900.p
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ng (http://woot math cub.s3.amazonaws.com/ss/74690/12d Yq8M01.14722350312
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99.png)
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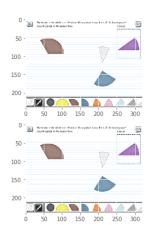
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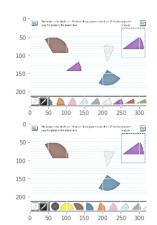
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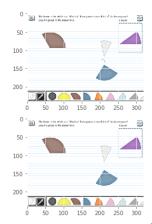
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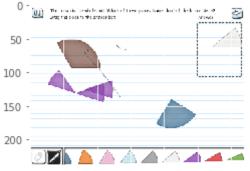
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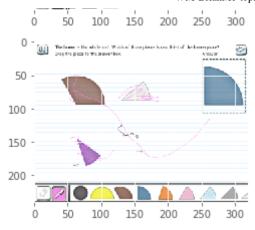
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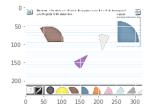
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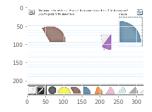
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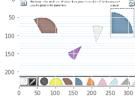
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### WM-BrianMc-topics-Method2-Top\_10\_qual\_id\_clusters





## Cluster 4

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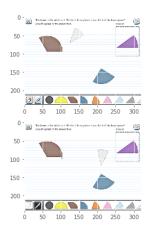
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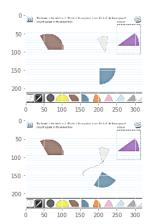
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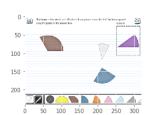
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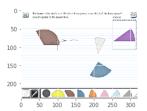
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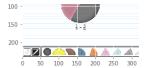
Analysis 3 for qual\_id TJxldqZMXd.partb.gqJqOrIhu\_ with 18390 samples Session 0 txt Drag one sixth pieces to cover all of the 2/3 shown. Answer: 4

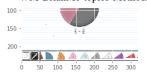
Extracting tf-idf features ...

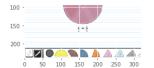
done in 0.297s.

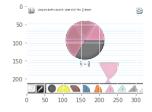
Clustering with MiniBatchKMeans(batch\_size=1000, compute\_labels=True, ini

```
ι- κ-meaπs⊤τ ,
               init size=1000, max iter=100, max no improvement=10, n clusters=1
0,
               n_init=1, random_state=42, reassignment_ratio=0.01, tol=0.0,
               verbose=0)
done in 0.147s
qual id TJxldqZMXd.partb.gqJqOrIhu_ has these clusters
1
          515
4
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5
         253
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         239
8
          183
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          165
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            22
Name: cluster, dtype: int64
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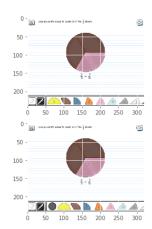
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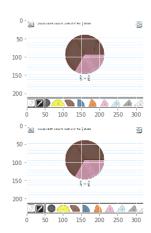
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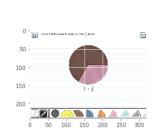
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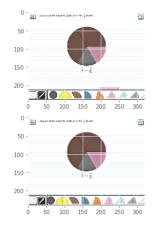
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# Cluster 4

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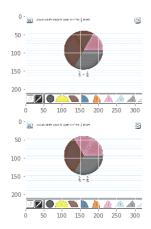
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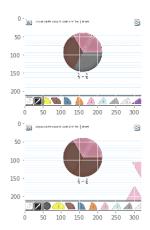
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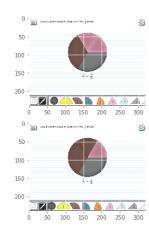
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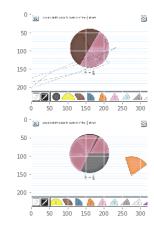
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### Cluster 5

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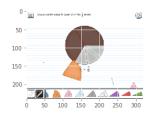
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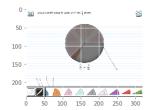
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```
Analysis 4 for qual id TJxldqZMXd.partb.9L iTwGd5z with 18197 samples
Session 0 txt Drag one eighth pieces to cover all of the 3/4
Answer: 6
Extracting tf-idf features ...
done in 0.334s.
Clustering with MiniBatchKMeans(batch size=1000, compute labels=True, ini
t='k-means++',
        init size=1000, max iter=100, max no improvement=10, n clusters=1
0,
        n init=1, random state=42, reassignment ratio=0.01, tol=0.0,
        verbose=0)
done in 0.137s
qual id TJxldqZMXd.partb.9L iTwGd5z has these clusters
0
     1094
4
      409
2
      317
1
      206
3
      144
5
      122
8
       48
6
       34
9
       28
```

21

Name: cluster, dtype: int64

Cluster 0

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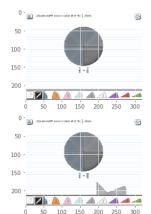
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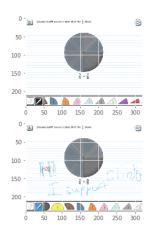
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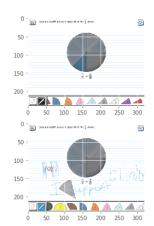
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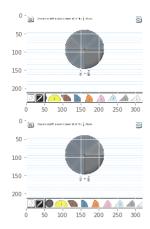
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# Cluster 4

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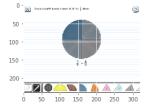
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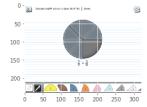
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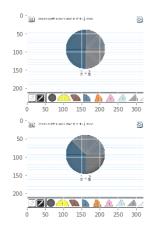
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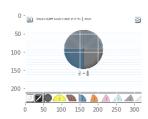
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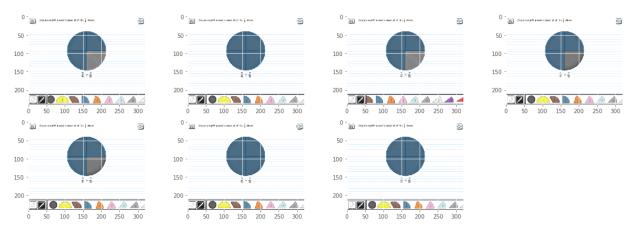
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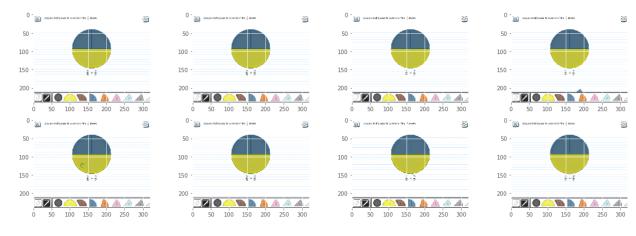
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58.png)
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z.1475706143958.png (http://woot math cub.s3.amazonaws.com/ss/85101/9L iT
wGd5z.1475706143958.png)
<matplotlib.figure.Figure at 0x1639849b0>
Analysis 5 for qual id TJxldqZMXd.partb.W2tLvQTbkI with 17800 samples
Session 0 txt Drag one half pieces to cover all of the 2/4 shown.
Answer: 1
Extracting tf-idf features ...
done in 0.227s.
Clustering with MiniBatchKMeans(batch size=1000, compute labels=True, ini
t='k-means++',
        init size=1000, max iter=100, max no improvement=10, n clusters=1
0,
        n init=1, random state=42, reassignment ratio=0.01, tol=0.0,
        verbose=0)
done in 0.107s
qual id TJxldqZMXd.partb.W2tLvQTbkI has these clusters
3
1
     347
7
     341
2
     254
8
     194
6
     130
4
     127
0
      83
      62
      47
Name: cluster, dtype: int64
Cluster 3
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ng (http://woot math cub.s3.amazonaws.com/ss/74653/W2tLvQTbkI.14707536908
66.png)
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81.png)
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67.png)
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ng (http://woot\_math\_cub.s3.amazonaws.com/ss/77567/W2tLvQTbkI.14728463397
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#### Cluster 1

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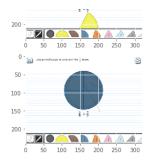
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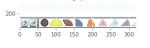
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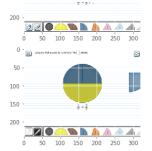
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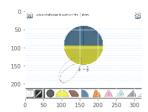
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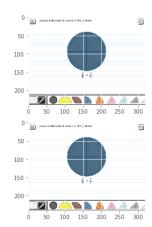
# 52.png)

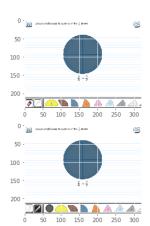
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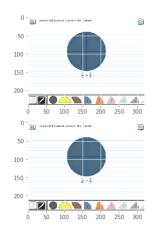
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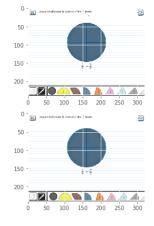
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### Cluster 2

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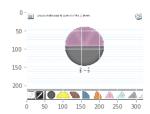
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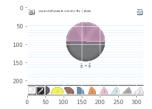
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Analysis 6 for qual\_id 9wRCzK1G7F.partb.SHkv5F\_Yzi with 17466 samples Session 0 txt The orange is the whole unit. Which of these pieces is one half of the orange piece?

Drag the piece to the answer box.

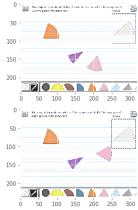
Answer: 1/10

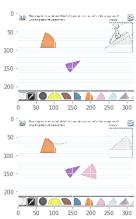
Extracting tf-idf features ...

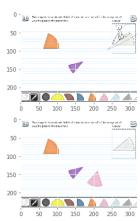
done in 0.823s.

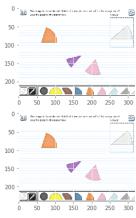
Clustering with MiniBatchKMeans(batch\_size=1000, compute\_labels=True, init='k-means++',

```
init size=1000, max iter=100, max no improvement=10, n clusters=1
0,
                   n init=1, random state=42, reassignment ratio=0.01, tol=0.0,
                   verbose=0)
done in 0.085s
qual id 9wRCzK1G7F.partb.SHkv5F Yzi has these clusters
1
2
            1278
7
              808
3
              440
9
              231
4
              194
8
              171
5
              125
                32
6
n
                   9
Name: cluster, dtype: int64
Cluster 1
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ng (http://woot math cub.s3.amazonaws.com/ss/74327/SHkv5F Yzi.14702985330
21.png)
http://woot math cub.s3.amazonaws.com/ss/74151/SHkv5F Yzi.1470250546472.p
ng (http://woot math cub.s3.amazonaws.com/ss/74151/SHkv5F Yzi.14702505464
72.png)
http://woot math cub.s3.amazonaws.com/ss/74151/SHkv5F Yzi.1470250550261.p
ng (http://woot math cub.s3.amazonaws.com/ss/74151/SHkv5F Yzi.14702505502
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12.png)
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Cluster 2

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could not read http://woot\_math\_cub.s3.amazonaws.com/ss/74709/SHkv5F\_Yz
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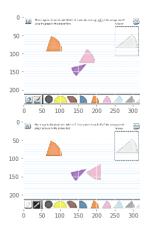
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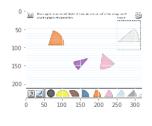
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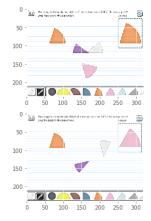
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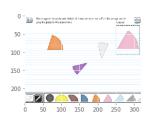
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# Cluster 7

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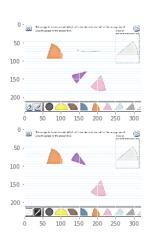
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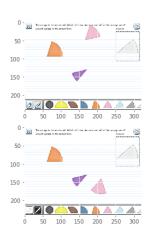
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ng (http://woot\_math\_cub.s3.amazonaws.com/ss/77647/SHkv5F\_Yz1.14732739681
72.png)

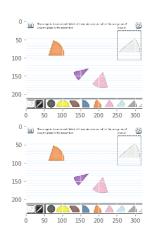
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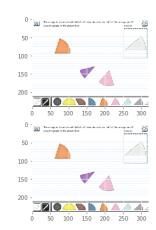
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# Cluster 3

http://woot\_math\_cub.s3.amazonaws.com/ss/74320/SHkv5F\_Yzi.1470298230909.png (http://woot\_math\_cub.s3.amazonaws.com/ss/74320/SHkv5F\_Yzi.1470298230909.png)

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http://woot\_math\_cub.s3.amazonaws.com/ss/77158/SHkv5F\_Yzi.1473257563783.p ng (http://woot\_math\_cub.s3.amazonaws.com/ss/77158/SHkv5F\_Yzi.1473257563783.png)

could not read http://woot\_math\_cub.s3.amazonaws.com/ss/77158/SHkv5F\_Yz
i.1473257563783.png (http://woot\_math\_cub.s3.amazonaws.com/ss/77158/SHkv5
F Yzi.1473257563783.png)

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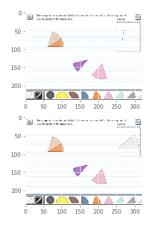
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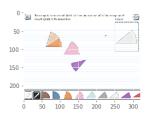
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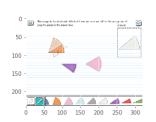
could not read http://woot\_math\_cub.s3.amazonaws.com/ss/76336/SHkv5F\_Yz
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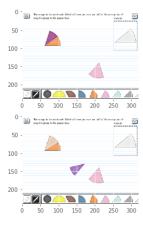
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http://woot\_math\_cub.s3.amazonaws.com/ss/76877/SHkv5F\_Yzi.1473686811655.p ng (http://woot\_math\_cub.s3.amazonaws.com/ss/76877/SHkv5F\_Yzi.14736868116 55.png)









Analysis 7 for qual\_id TJxldqZMXd.partb.hxSleqLik1 with 17191 samples Session 0 txt Drag one half pieces to cover all of the 4/8 shown.

Answer: 1

Extracting tf-idf features ...

done in 0.110s.

Clustering with MiniBatchKMeans(batch\_size=1000, compute\_labels=True, init='k-means++',

init\_size=1000, max\_iter=100, max\_no\_improvement=10, n\_clusters=1
0,

n\_init=1, random\_state=42, reassignment\_ratio=0.01, tol=0.0,
verbose=0)

done in 0.048s

qual id TJxldqZMXd.partb.hxS1eqLik1 has these clusters

- 3 265
- 1 240
- 5 150
- 6 121
- 2 72
- 0 72
- 8 46
- 9 40
- 4 30

7 22

Name: cluster, dtype: int64

Cluster 3

http://woot\_math\_cub.s3.amazonaws.com/ss/74237/hxSleqLik1.1470636297167.png (http://woot\_math\_cub.s3.amazonaws.com/ss/74237/hxSleqLik1.1470636297167.png)

http://woot\_math\_cub.s3.amazonaws.com/ss/74654/hxS1eqLik1.1470754406444.png (http://woot\_math\_cub.s3.amazonaws.com/ss/74654/hxS1eqLik1.1470754406444.png)

http://woot\_math\_cub.s3.amazonaws.com/ss/74224/hxS1eqLik1.1471907215068.p ng (http://woot\_math\_cub.s3.amazonaws.com/ss/74224/hxS1eqLik1.1471907215068.png)

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http://woot\_math\_cub.s3.amazonaws.com/ss/76901/hxS1eqLik1.1473255335551.p ng (http://woot\_math\_cub.s3.amazonaws.com/ss/76901/hxS1eqLik1.1473255335551.png)

could not read http://woot\_math\_cub.s3.amazonaws.com/ss/76901/hxS1eqLik
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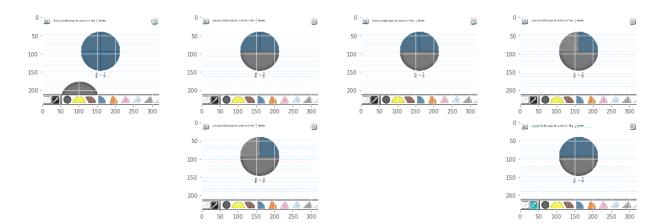
0/ (1 1 MAD) M ( ' M (1 10 T 10 1 1 1 ( ' 1

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ng (http://woot\_math\_cub.s3.amazonaws.com/ss/76901/hxS1eqLik1.14733408055
13.png)

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could not read http://woot\_math\_cub.s3.amazonaws.com/ss/76891/hxS1eqLik
1.1473424914548.png (http://woot\_math\_cub.s3.amazonaws.com/ss/76891/hxS1e
qLik1.1473424914548.png)

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# Cluster 1

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could not read http://woot\_math\_cub.s3.amazonaws.com/ss/77161/hxSleqLik
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qLik1.1473266002298.png)

http://woot\_math\_cub.s3.amazonaws.com/ss/77102/hxS1eqLik1.1473695263452.p ng (http://woot\_math\_cub.s3.amazonaws.com/ss/77102/hxS1eqLik1.1473695263452.png)

could not read http://woot\_math\_cub.s3.amazonaws.com/ss/77102/hxSleqLik
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could not read http://woot\_math\_cub.s3.amazonaws.com/ss/77102/hxS1eqLik
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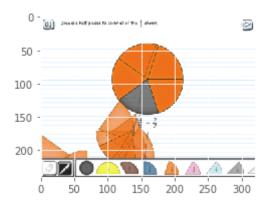
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# Cluster 5

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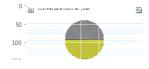
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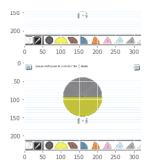
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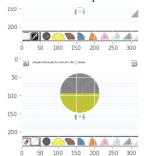
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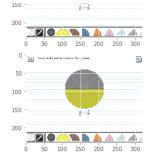


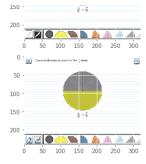


#### WM-BrianMc-topics-Method2-Top\_10\_qual\_id\_clusters









Cluster 6

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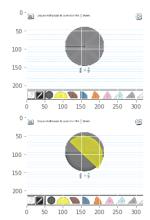
http://woot\_math\_cub.s3.amazonaws.com/ss/83921/hxS1eqLik1.1474988079833.p ng (http://woot\_math\_cub.s3.amazonaws.com/ss/83921/hxS1eqLik1.14749880798 33.png)

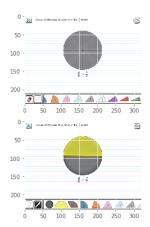
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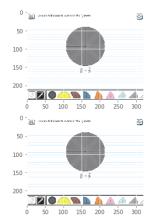
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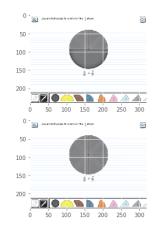
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http://woot\_math\_cub.s3.amazonaws.com/ss/85369/hxS1eqLik1.1476285473932.png (http://woot\_math\_cub.s3.amazonaws.com/ss/85369/hxS1eqLik1.1476285473932.png)









Analysis 8 for qual\_id 9wRCzK1G7F.partb.qGGEQyiE\_j with 17007 samples Session 0 txt The yellow is the whole unit. Which of these pieces is one half of the yellow piece?

Drag the piece to the answer box.

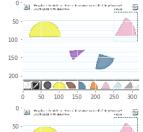
Answer: 1/4

Extracting tf-idf features ...

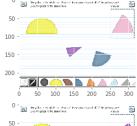
done in 0.333s.

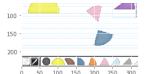
Clustering with MiniBatchKMeans(batch\_size=1000, compute\_labels=True, init='k-means++',

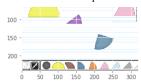
```
init_size=1000, max_iter=100, max_no_improvement=10, n_clusters=1
0,
        n_init=1, random_state=42, reassignment_ratio=0.01, tol=0.0,
        verbose=0)
done in 0.065s
qual id 9wRCzK1G7F.partb.qGGEQyiE j has these clusters
5
9
      541
0
      411
1
      381
4
      377
2
      367
3
      227
8
      104
7
       51
       21
Name: cluster, dtype: int64
Cluster 5
http://woot math cub.s3.amazonaws.com/ss/74281/qGGEQyiE j.1471477975701.p
ng (http://woot_math_cub.s3.amazonaws.com/ss/74281/qGGEQyiE_j.14714779757
01.png)
could not read http://woot math cub.s3.amazonaws.com/ss/74281/qGGEQyiE
j.1471477975701.png (http://woot math cub.s3.amazonaws.com/ss/74281/qGGEQ
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70.png)
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could not read http://woot math cub.s3.amazonaws.com/ss/76139/qGGEQyiE
j.1472837451250.png (http://woot math cub.s3.amazonaws.com/ss/76139/qGGEQ
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03.png)
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28.png)
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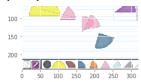


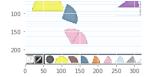












# Cluster 9

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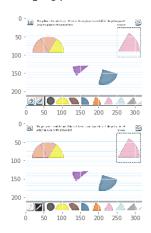
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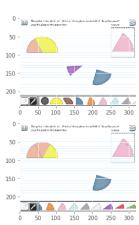
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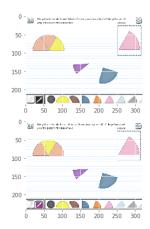
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#### Cluster 0

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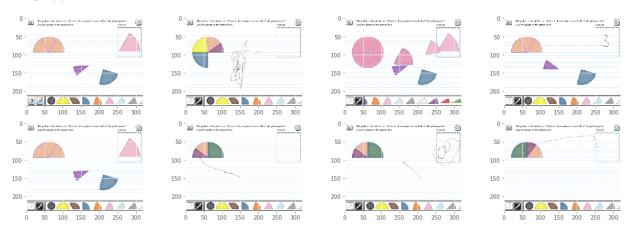
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#### Cluster 1

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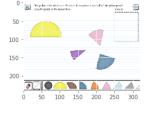
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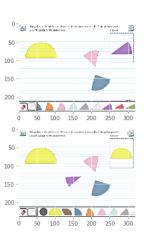
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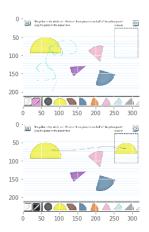
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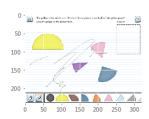
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36.png)









Analysis 9 for qual\_id kvig7fcCVc.partb.3y7UMHuR\_i with 16876 samples Session 0 txt Arrange these fractions from least to greatest.

Drag each fraction into one of the boxes below.

Answer: 2/8,2/6,2/4

Extracting tf-idf features ...

done in 0.595s.

Clustering with MiniBatchKMeans(batch\_size=1000, compute\_labels=True, init='k-means++',

init\_size=1000, max\_iter=100, max\_no\_improvement=10, n\_clusters=1
0,

n\_init=1, random\_state=42, reassignment\_ratio=0.01, tol=0.0,
verbose=0)

done in 0.054s

qual id kviq7fcCVc.partb.3y7UMHuR i has these clusters

- 2 1507 0 1080 1 171 9 12 3 3 8 3 7 2
- 5 2
- 6 2 4 2

Name: cluster, dtype: int64

Cluster 2

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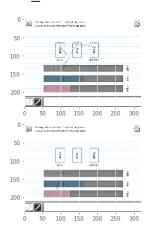
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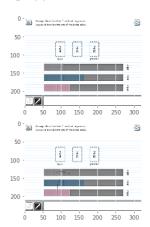
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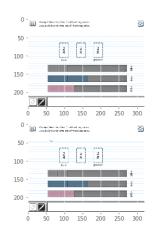
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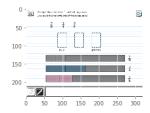
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# Cluster 0

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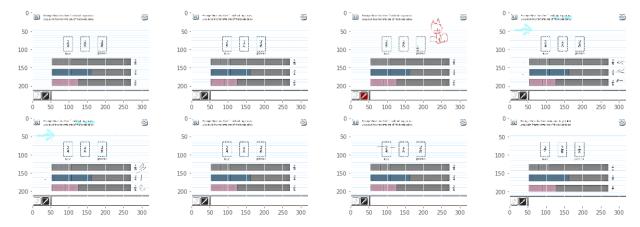
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# Cluster 1

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# Cluster 9

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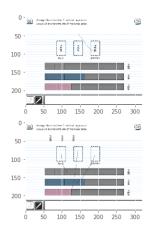
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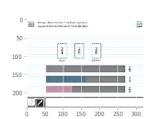
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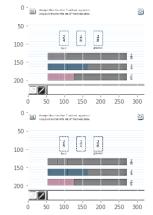
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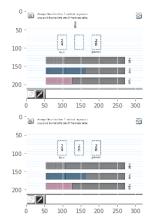
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