## FilterClasses

## November 12, 2022

```
[20]: import numpy as np
      import os
      import pandas as pd
      import os
      import tensorflow as tf
      from keras.preprocessing.image import ImageDataGenerator
      from keras.preprocessing import image
      from random import sample
[21]: train_dir = 'images'
      dfPath = 'train.csv'
      df = pd.read_csv(dfPath)
      df = df.astype(str)
[22]: amt = df.groupby(['hotel_id'])['hotel_id'].count().reset_index(name="counts")
      amt.columns = ["hotel","county"]
      amt = amt[amt["county"] < 10]</pre>
      idxesToDelete = []
      for idx, rowHotelCat in amt.iterrows():
          hotelCat = rowHotelCat["hotel"]
          #print(hotelCat)
          #print(df[df["hotel_id"] == hotelCat].index)
          df.drop(df[df["hotel_id"] == hotelCat].index, inplace = True)
      newAmt = df.groupby(['hotel_id'])['hotel_id'].count().reset_index(name="counts")
      newAmt.columns = ["hotel","county"]
      print(newAmt)
```

```
hotel county
0 100206 17
1 100297 19
2 10031 16
```

```
3
           100326
                       20
           100410
                        19
     1371
            99038
                       22
     1372
             9906
                       16
     1373
            99234
                        16
     1374
            99311
                       11
     1375
             9991
                        14
     [1376 rows x 2 columns]
[23]: df.to_csv("new.csv")
[25]: import random
      train = df
      valid = pd.DataFrame()
      proportion = 0.2
      for idx, rowHotelCat in newAmt.iterrows():
          hotelCat = rowHotelCat["hotel"]
          amount = rowHotelCat["county"]
          target = int(amount * proportion)
          chosenIdx = list(df[df["hotel_id"] == hotelCat].index.values)
          toMove = random.sample(chosenIdx, target)
          rowsToMove = df.loc[toMove]
          train.drop(toMove, inplace = True)
          valid = pd.concat([valid, rowsToMove], ignore_index = True)
          for i,row in rowsToMove.iterrows():
              os.rename(os.path.join(train_dir,row["image_id"]),os.path.

→join('test',row["image_id"]))
      train.to_csv("trainSplit.csv")
      valid.to_csv("validSplit.csv")
[28]: print(len(os.listdir("images")))
      print(len(os.listdir("test")))
     38526
     6178
[13]: import random
```

```
targetMax = 75
      for idx, rowHotelCat in newAmt.iterrows():
          hotelCat = rowHotelCat["hotel"]
          amount = rowHotelCat["county"]
          if amount > targetMax:
              chosenIdx = list(df[df["hotel_id"] == hotelCat].index.values)
              toDelete = random.sample(chosenIdx, amount - targetMax)
              df.drop(toDelete, inplace = True)
      newAmt = df.groupby(['hotel_id'])['hotel_id'].count().reset_index(name="counts")
      newAmt.columns = ["hotel","county"]
      #print(newAmt)
[14]: df.to_csv("withoutBiggest.csv")
[19]: train_datagen = ImageDataGenerator(rescale=1/255,
                                         rotation range=40,
                                         width_shift_range=0.2,
                                         height_shift_range=0.2,
                                          shear_range=0.2,
                                          zoom_range=0.2,
                                         horizontal_flip=True,
                                          fill_mode='nearest')
[20]: overSampled = df
      target = 30
      for idx, rowHotelCat in newAmt.iterrows():
          hotelCat = rowHotelCat["hotel"]
          amount = rowHotelCat["county"]
          imagesInCat = list(df[df["hotel_id"] == hotelCat].index.values)
          amount = len(imagesInCat)
          nToPrint = target - amount
          nToPrint = min(amount,nToPrint)
          if int(nToPrint) > 0:
              toAugment = random.sample(imagesInCat, nToPrint)
              made = 0
              print("Making", nToPrint,"for:", hotelCat)
              for currIdxImage in toAugment:
                  if made < nToPrint:</pre>
                      img_path = df.loc[currIdxImage]["image_id"]
                      img_path = os.path.join(train_dir, img_path)
                      img = tf.keras.preprocessing.image.load_img(img_path)
                      img_array = tf.keras.preprocessing.image.img_to_array(img)
```

```
img_array = img_array.reshape((1,) + img_array.shape)

for batch in train_datagen.flow(img_array, batch_size=1):
    temp = tf.keras.preprocessing.image.array_to_img(batch[0])
    name = hotelCat + 'x'+ str(made) + '.jpg'
    nameTwo = os.path.join(train_dir, name)
    temp.save(nameTwo)
    made += 1
    row = pd.DataFrame({"image_id" : name, "hotel_id":_
    ohotelCat}, index=[0])
    overSampled = pd.concat([overSampled, row], ignore_index =_
    otherwise

True)

break

if made >= nToPrint:
    break
```

Making 13 for: 100206 Making 11 for: 100297 Making 14 for: 10031 Making 10 for: 100326 Making 11 for: 100410 Making 14 for: 10054 Making 12 for: 100784 Making 10 for: 1009 Making 10 for: 101899 Making 14 for: 102119 Making 2 for: 102219 Making 14 for: 10290 Making 10 for: 102995 Making 14 for: 103319 Making 8 for: 103379 Making 15 for: 103533 Making 8 for: 103650 Making 10 for: 10389 Making 12 for: 10411 Making 12 for: 10503 Making 11 for: 10578 Making 10 for: 10678 Making 9 for: 10684 Making 8 for: 107043 Making 12 for: 107115 Making 11 for: 10766 Making 12 for: 10785 Making 3 for: 10849 Making 12 for: 108817 Making 11 for: 10884

Making 11 for: 10959 Making 6 for: 110119 Making 12 for: 11025 Making 11 for: 11039 Making 15 for: 110509 Making 11 for: 11060 Making 3 for: 11099 Making 15 for: 11101 Making 11 for: 11165 Making 6 for: 11200 Making 12 for: 11257 Making 13 for: 11289 Making 14 for: 11311 Making 12 for: 113206 Making 14 for: 1144 Making 12 for: 114886 Making 14 for: 115137 Making 10 for: 11522 Making 13 for: 11545 Making 12 for: 11559 Making 8 for: 115775 Making 14 for: 11581 Making 12 for: 11600 Making 14 for: 11646 Making 4 for: 11652 Making 14 for: 116718 Making 9 for: 11672 Making 12 for: 116964 Making 12 for: 116992 Making 11 for: 117083 Making 15 for: 11725 Making 12 for: 117631 Making 13 for: 117772 Making 12 for: 118455 Making 14 for: 118824 Making 15 for: 11889 Making 14 for: 11950 Making 15 for: 11982 Making 12 for: 120013 Making 8 for: 1201 Making 14 for: 120255 Making 14 for: 120942 Making 7 for: 1210 Making 13 for: 12108 Making 15 for: 121134 Making 12 for: 12117 Making 10 for: 121187 Making 15 for: 1215

Making 14 for: 12189 Making 2 for: 122067 Making 13 for: 122919 Making 15 for: 123709 Making 8 for: 12387 Making 11 for: 12398 Making 7 for: 12485 Making 14 for: 125049 Making 2 for: 12540 Making 9 for: 125646 Making 6 for: 125715 Making 6 for: 12682 Making 12 for: 12685 Making 2 for: 12809 Making 6 for: 12878 Making 15 for: 12922 Making 9 for: 12958 Making 12 for: 12977 Making 1 for: 12994 Making 12 for: 130103 Making 10 for: 13043 Making 10 for: 13077 Making 15 for: 13100 Making 13 for: 13166 Making 13 for: 132880 Making 15 for: 13391 Making 12 for: 133964 Making 12 for: 13416 Making 12 for: 13425 Making 12 for: 134580 Making 3 for: 13469 Making 8 for: 13470 Making 10 for: 13525 Making 12 for: 13621 Making 12 for: 13633 Making 2 for: 13736 Making 10 for: 13796 Making 12 for: 13800 Making 6 for: 13867 Making 13 for: 139478 Making 12 for: 13977 Making 6 for: 14013 Making 13 for: 140793 Making 12 for: 141202 Making 14 for: 14121 Making 4 for: 141562 Making 12 for: 141614 Making 12 for: 141633

Making 11 for: 14175 Making 12 for: 14332 Making 13 for: 14366 Making 13 for: 144064 Making 12 for: 144190 Making 10 for: 144712 Making 5 for: 14474 Making 9 for: 144869 Making 9 for: 1449 Making 10 for: 14599 Making 10 for: 14727 Making 10 for: 14854 Making 14 for: 14975 Making 14 for: 15078 Making 12 for: 1521 Making 13 for: 15236 Making 12 for: 15263 Making 10 for: 15329 Making 10 for: 15352 Making 12 for: 15395 Making 7 for: 15433 Making 11 for: 15482 Making 9 for: 15509 Making 12 for: 15522 Making 15 for: 1562 Making 14 for: 15981 Making 12 for: 15994 Making 12 for: 16041 Making 12 for: 16068 Making 11 for: 16157 Making 8 for: 16160 Making 14 for: 16215 Making 12 for: 16380 Making 11 for: 16452 Making 10 for: 16461 Making 13 for: 16505 Making 12 for: 16666 Making 10 for: 16677 Making 12 for: 16722 Making 6 for: 16751 Making 15 for: 16761 Making 11 for: 16784 Making 11 for: 16814 Making 12 for: 16864 Making 12 for: 1688 Making 12 for: 16916 Making 2 for: 16972 Making 10 for: 16974

Making 15 for: 16984 Making 11 for: 17071 Making 5 for: 1710 Making 14 for: 17126 Making 15 for: 17174 Making 5 for: 17218 Making 6 for: 17220 Making 2 for: 17421 Making 14 for: 17424 Making 15 for: 17613 Making 15 for: 17704 Making 12 for: 17705 Making 14 for: 17711 Making 13 for: 17717 Making 12 for: 1777 Making 12 for: 1778 Making 13 for: 17935 Making 12 for: 1797 Making 12 for: 18032 Making 11 for: 18094 Making 9 for: 18102 Making 14 for: 18134 Making 14 for: 18151 Making 10 for: 18187 Making 10 for: 18268 Making 9 for: 18410 Making 12 for: 18421 Making 12 for: 18488 Making 10 for: 18608 Making 12 for: 18664 Making 12 for: 18706 Making 12 for: 18734 Making 14 for: 18800 Making 9 for: 18801 Making 11 for: 18854 Making 14 for: 18971 Making 10 for: 18977 Making 14 for: 19035 Making 12 for: 1906 Making 7 for: 1910 Making 13 for: 19101 Making 11 for: 1912 Making 12 for: 19127 Making 12 for: 19167 Making 12 for: 19180 Making 10 for: 19280 Making 13 for: 19394 Making 12 for: 19403 Making 11 for: 19683 Making 14 for: 197027 Making 10 for: 197146 Making 11 for: 197377 Making 15 for: 197432 Making 12 for: 197591 Making 12 for: 197594 Making 14 for: 197632 Making 10 for: 197702 Making 12 for: 197790 Making 13 for: 197820 Making 15 for: 197833 Making 10 for: 197908 Making 11 for: 197990 Making 14 for: 198145 Making 12 for: 198154 Making 2 for: 198182 Making 10 for: 198245 Making 6 for: 19826 Making 10 for: 198436 Making 10 for: 19847 Making 15 for: 198474 Making 14 for: 198577 Making 12 for: 19859 Making 7 for: 198692 Making 10 for: 198828 Making 12 for: 19889 Making 13 for: 19891 Making 14 for: 198998 Making 3 for: 199047 Making 10 for: 199051 Making 12 for: 199156 Making 12 for: 199287 Making 14 for: 199295 Making 10 for: 199664 Making 10 for: 199724 Making 14 for: 19977 Making 12 for: 199802 Making 5 for: 199844 Making 12 for: 200039 Making 6 for: 200079 Making 14 for: 200297 Making 12 for: 200401 Making 14 for: 20069 Making 10 for: 200696 Making 14 for: 200877 Making 12 for: 201025 Making 12 for: 201370

Making 10 for: 201430 Making 12 for: 20144 Making 12 for: 20156 Making 11 for: 201581 Making 8 for: 201638 Making 12 for: 202064 Making 12 for: 202121 Making 14 for: 202125 Making 13 for: 202193 Making 14 for: 202345 Making 14 for: 20236 Making 12 for: 202490 Making 14 for: 202496 Making 12 for: 202863 Making 14 for: 202992 Making 11 for: 203044 Making 15 for: 203092 Making 2 for: 203152 Making 14 for: 203154 Making 12 for: 203215 Making 14 for: 203556 Making 12 for: 203574 Making 15 for: 204195 Making 14 for: 204284 Making 10 for: 204353 Making 12 for: 204361 Making 14 for: 204416 Making 12 for: 204485 Making 6 for: 20453 Making 12 for: 20462 Making 14 for: 204632 Making 14 for: 204696 Making 7 for: 20509 Making 4 for: 205161 Making 12 for: 205419 Making 11 for: 205444 Making 14 for: 205560 Making 14 for: 205640 Making 10 for: 205965 Making 11 for: 206088 Making 13 for: 20631 Making 12 for: 206615 Making 12 for: 206668 Making 10 for: 206692 Making 12 for: 207118 Making 12 for: 207228 Making 12 for: 207268 Making 4 for: 207293

Making 12 for: 207707 Making 7 for: 207959 Making 15 for: 208080 Making 13 for: 208107 Making 10 for: 208146 Making 12 for: 208235 Making 12 for: 208275 Making 12 for: 208594 Making 11 for: 208603 Making 12 for: 208614 Making 14 for: 208628 Making 15 for: 208672 Making 15 for: 20870 Making 13 for: 208715 Making 13 for: 208762 Making 12 for: 20877 Making 11 for: 208778 Making 13 for: 208779 Making 12 for: 208790 Making 12 for: 208955 Making 12 for: 2093 Making 11 for: 209431 Making 12 for: 209685 Making 6 for: 209710 Making 12 for: 209817 Making 14 for: 209902 Making 8 for: 209903 Making 12 for: 210175 Making 14 for: 21027 Making 12 for: 210276 Making 2 for: 210388 Making 12 for: 21072 Making 13 for: 21152 Making 8 for: 21196 Making 12 for: 212137 Making 10 for: 21235 Making 12 for: 21422 Making 9 for: 21502 Making 14 for: 21534 Making 11 for: 21618 Making 15 for: 21676 Making 12 for: 21678 Making 12 for: 21682 Making 15 for: 21738 Making 12 for: 21850 Making 12 for: 21933 Making 10 for: 21940 Making 10 for: 21984

Making 12 for: 22026 Making 11 for: 22046 Making 7 for: 22061 Making 12 for: 22063 Making 10 for: 22111 Making 12 for: 22252 Making 12 for: 2234 Making 9 for: 22406 Making 14 for: 22441 Making 6 for: 22442 Making 12 for: 22473 Making 14 for: 22482 Making 12 for: 22546 Making 12 for: 22612 Making 14 for: 22789 Making 14 for: 22832 Making 8 for: 22940 Making 14 for: 23023 Making 12 for: 230417 Making 12 for: 230802 Making 12 for: 23095 Making 4 for: 23167 Making 12 for: 23202 Making 12 for: 23348 Making 13 for: 235207 Making 14 for: 236345 Making 12 for: 23650 Making 13 for: 2368 Making 5 for: 2371 Making 12 for: 237266 Making 9 for: 23783 Making 12 for: 23840 Making 10 for: 240118 Making 10 for: 24072 Making 10 for: 24173 Making 10 for: 2423 Making 13 for: 24275 Making 12 for: 2430 Making 12 for: 24316 Making 13 for: 24365 Making 13 for: 24412 Making 11 for: 24652 Making 10 for: 24670 Making 12 for: 2469 Making 8 for: 24786 Making 10 for: 249786 Making 10 for: 25103 Making 10 for: 25152

Making 9 for: 25171 Making 12 for: 2523 Making 2 for: 25271 Making 8 for: 25355 Making 15 for: 25441 Making 15 for: 257725 Making 14 for: 2578 Making 11 for: 257954 Making 12 for: 258395 Making 12 for: 25844 Making 6 for: 25890 Making 12 for: 259281 Making 11 for: 25935 Making 14 for: 25958 Making 11 for: 25962 Making 10 for: 25983 Making 3 for: 26077 Making 10 for: 26178 Making 12 for: 262903 Making 14 for: 26327 Making 12 for: 2634 Making 12 for: 2640 Making 10 for: 26421 Making 6 for: 26529 Making 10 for: 2665 Making 12 for: 26709 Making 14 for: 26764 Making 12 for: 26882 Making 10 for: 26892 Making 11 for: 26914 Making 11 for: 26950 Making 12 for: 26975 Making 14 for: 26997 Making 12 for: 27024 Making 12 for: 27333 Making 10 for: 27397 Making 12 for: 27418 Making 11 for: 27497 Making 12 for: 27505 Making 11 for: 27520 Making 12 for: 27575 Making 14 for: 27629 Making 10 for: 27715 Making 4 for: 27824 Making 14 for: 27858 Making 15 for: 27929 Making 11 for: 2810 Making 6 for: 28118

Making 12 for: 28152 Making 12 for: 28166 Making 12 for: 282409 Making 12 for: 282752 Making 8 for: 283534 Making 13 for: 2842 Making 2 for: 28477 Making 6 for: 28508 Making 12 for: 28526 Making 14 for: 28527 Making 14 for: 28544 Making 12 for: 28557 Making 10 for: 286036 Making 14 for: 28636 Making 1 for: 28666 Making 14 for: 28683 Making 12 for: 286913 Making 12 for: 28709 Making 11 for: 28741 Making 12 for: 28800 Making 8 for: 28821 Making 12 for: 2884 Making 3 for: 288895 Making 14 for: 28892 Making 12 for: 28906 Making 12 for: 2891 Making 11 for: 28992 Making 6 for: 28994 Making 2 for: 2913 Making 12 for: 29156 Making 4 for: 29247 Making 10 for: 29396 Making 10 for: 2943 Making 6 for: 29459 Making 3 for: 2953 Making 12 for: 29562 Making 14 for: 29689 Making 13 for: 29713 Making 2 for: 2991 Making 3 for: 29985 Making 12 for: 30090 Making 12 for: 301542 Making 7 for: 30167 Making 14 for: 30185 Making 11 for: 3023 Making 14 for: 30269 Making 12 for: 30365 Making 12 for: 30377

Making 12 for: 30387 Making 11 for: 30395 Making 13 for: 305432 Making 12 for: 305540 Making 6 for: 305551 Making 12 for: 305637 Making 12 for: 305647 Making 4 for: 30568 Making 6 for: 305774 Making 13 for: 305944 Making 10 for: 306029 Making 12 for: 306036 Making 12 for: 306064 Making 12 for: 306105 Making 12 for: 306123 Making 6 for: 306134 Making 13 for: 306244 Making 11 for: 306328 Making 6 for: 30637 Making 12 for: 306414 Making 8 for: 306415 Making 13 for: 306554 Making 12 for: 306604 Making 12 for: 306641 Making 12 for: 306737 Making 11 for: 306775 Making 12 for: 306885 Making 12 for: 306891 Making 12 for: 306935 Making 14 for: 306976 Making 12 for: 3070 Making 12 for: 307052 Making 14 for: 307143 Making 12 for: 307257 Making 12 for: 307269 Making 15 for: 307360 Making 11 for: 307492 Making 12 for: 307566 Making 12 for: 307612 Making 14 for: 307689 Making 13 for: 307838 Making 6 for: 307892 Making 12 for: 307902 Making 6 for: 307961 Making 12 for: 307983 Making 12 for: 308098 Making 11 for: 308107 Making 14 for: 308181

Making 11 for: 308213 Making 12 for: 308286 Making 12 for: 308338 Making 12 for: 308451 Making 12 for: 308639 Making 12 for: 308677 Making 14 for: 308697 Making 12 for: 308715 Making 12 for: 308756 Making 12 for: 308760 Making 10 for: 308766 Making 12 for: 308791 Making 12 for: 308815 Making 11 for: 308824 Making 15 for: 308888 Making 12 for: 308904 Making 14 for: 308913 Making 12 for: 30892 Making 14 for: 308987 Making 12 for: 309031 Making 2 for: 309032 Making 12 for: 309070 Making 12 for: 3091 Making 12 for: 309163 Making 11 for: 309176 Making 12 for: 309235 Making 12 for: 309244 Making 14 for: 309267 Making 12 for: 309328 Making 12 for: 309352 Making 6 for: 309397 Making 10 for: 309442 Making 14 for: 309499 Making 12 for: 309542 Making 8 for: 309573 Making 14 for: 309579 Making 14 for: 309603 Making 12 for: 309609 Making 10 for: 309665 Making 14 for: 30968 Making 10 for: 30970 Making 15 for: 309725 Making 12 for: 309769 Making 13 for: 30979 Making 12 for: 309809 Making 10 for: 309821 Making 11 for: 309858 Making 15 for: 309918 Making 10 for: 309934 Making 12 for: 309987 Making 12 for: 310030 Making 11 for: 310033 Making 6 for: 310043 Making 14 for: 31006 Making 12 for: 310083 Making 11 for: 310093 Making 6 for: 310174 Making 12 for: 310183 Making 12 for: 310188 Making 4 for: 310205 Making 10 for: 310208 Making 12 for: 310219 Making 12 for: 310226 Making 12 for: 310252 Making 12 for: 310289 Making 12 for: 310291 Making 9 for: 310349 Making 12 for: 310425 Making 12 for: 310459 Making 12 for: 310667 Making 12 for: 310759 Making 10 for: 310767 Making 15 for: 310799 Making 14 for: 310976 Making 12 for: 311017 Making 12 for: 311019 Making 12 for: 31263 Making 14 for: 3143 Making 9 for: 31478 Making 12 for: 3157 Making 7 for: 31672 Making 12 for: 31766 Making 12 for: 31914 Making 11 for: 32043 Making 12 for: 32168 Making 6 for: 32169 Making 8 for: 3219 Making 12 for: 32335 Making 11 for: 3245 Making 13 for: 32635 Making 13 for: 32646 Making 7 for: 328604 Making 10 for: 32893 Making 12 for: 3291 Making 11 for: 32941 Making 12 for: 3297

Making 11 for: 32997 Making 12 for: 33025 Making 12 for: 33036 Making 7 for: 3313 Making 14 for: 33154 Making 15 for: 33158 Making 14 for: 33167 Making 6 for: 33288 Making 12 for: 33302 Making 12 for: 33476 Making 11 for: 33623 Making 11 for: 3374 Making 11 for: 34066 Making 12 for: 34507 Making 12 for: 34544 Making 12 for: 34549 Making 12 for: 3476 Making 13 for: 3480 Making 11 for: 34881 Making 2 for: 34906 Making 12 for: 34924 Making 13 for: 3499 Making 11 for: 35184 Making 10 for: 35321 Making 14 for: 35459 Making 12 for: 35566 Making 12 for: 3560 Making 14 for: 35737 Making 12 for: 35873 Making 4 for: 36078 Making 12 for: 36089 Making 14 for: 36124 Making 12 for: 36227 Making 12 for: 36297 Making 14 for: 3631 Making 12 for: 36341 Making 11 for: 3651 Making 14 for: 36528 Making 13 for: 36573 Making 5 for: 36754 Making 12 for: 36775 Making 1 for: 36891 Making 3 for: 3691 Making 12 for: 36988 Making 12 for: 37078 Making 11 for: 37701 Making 10 for: 37707 Making 7 for: 37722

Making 11 for: 37979 Making 12 for: 38149 Making 12 for: 38241 Making 7 for: 38358 Making 10 for: 38447 Making 14 for: 38448 Making 12 for: 38580 Making 11 for: 38585 Making 11 for: 38654 Making 10 for: 38684 Making 14 for: 38790 Making 12 for: 38889 Making 10 for: 38940 Making 11 for: 39189 Making 2 for: 39400 Making 14 for: 39430 Making 10 for: 39501 Making 4 for: 39520 Making 12 for: 39641 Making 10 for: 39736 Making 10 for: 39787 Making 12 for: 39963 Making 12 for: 40014 Making 12 for: 4057 Making 6 for: 40578 Making 2 for: 40806 Making 6 for: 40815 Making 1 for: 40941 Making 14 for: 4100 Making 12 for: 41003 Making 12 for: 41010 Making 14 for: 41155 Making 10 for: 41162 Making 10 for: 41333 Making 15 for: 41338 Making 14 for: 4153 Making 14 for: 41547 Making 14 for: 41897 Making 12 for: 42065 Making 15 for: 4210 Making 12 for: 42109 Making 14 for: 42849 Making 12 for: 430 Making 13 for: 4302 Making 13 for: 43075 Making 14 for: 43257 Making 13 for: 43294 Making 13 for: 43331

Making 12 for: 4338 Making 6 for: 43394 Making 12 for: 43548 Making 14 for: 43587 Making 10 for: 43595 Making 14 for: 436 Making 14 for: 4389 Making 6 for: 4394 Making 10 for: 44068 Making 5 for: 44093 Making 12 for: 44455 Making 14 for: 44521 Making 5 for: 44708 Making 2 for: 45168 Making 12 for: 45535 Making 15 for: 4572 Making 10 for: 4580 Making 10 for: 4587 Making 15 for: 459382 Making 12 for: 4611 Making 10 for: 46162 Making 10 for: 46261 Making 14 for: 46621 Making 14 for: 46784 Making 8 for: 47088 Making 10 for: 4709 Making 14 for: 4778 Making 14 for: 47870 Making 15 for: 4824 Making 14 for: 48314 Making 11 for: 48405 Making 14 for: 49872 Making 12 for: 5004 Making 10 for: 50098 Making 12 for: 5076 Making 8 for: 5106 Making 14 for: 5117 Making 11 for: 51186 Making 12 for: 51286 Making 12 for: 51387 Making 10 for: 51431 Making 9 for: 52232 Making 10 for: 5332 Making 12 for: 53405 Making 12 for: 5456 Making 6 for: 546 Making 10 for: 5478 Making 12 for: 5485

Making 8 for: 553 Making 14 for: 5579 Making 8 for: 563008 Making 8 for: 56447 Making 8 for: 5723 Making 12 for: 58268 Making 11 for: 5843 Making 12 for: 5905 Making 12 for: 592374 Making 10 for: 5964 Making 15 for: 5979 Making 14 for: 6064 Making 14 for: 6080 Making 7 for: 6086 Making 13 for: 6161 Making 12 for: 6222 Making 9 for: 6231 Making 14 for: 6294 Making 9 for: 6308 Making 5 for: 6311 Making 13 for: 6318 Making 13 for: 6323 Making 11 for: 6342 Making 12 for: 6348 Making 12 for: 64659 Making 12 for: 64663 Making 10 for: 6482 Making 10 for: 64972 Making 9 for: 6508 Making 12 for: 6514 Making 7 for: 6626 Making 12 for: 66454 Making 2 for: 6752 Making 12 for: 676 Making 14 for: 6774 Making 13 for: 6813 Making 14 for: 68314 Making 14 for: 6872 Making 12 for: 688446 Making 13 for: 688506 Making 9 for: 688634 Making 12 for: 688694 Making 13 for: 688899 Making 11 for: 689032 Making 12 for: 689197 Making 7 for: 689399 Making 10 for: 689708 Making 13 for: 689724

Making 7 for: 689762 Making 12 for: 689786 Making 13 for: 689852 Making 10 for: 689886 Making 14 for: 690011 Making 12 for: 690138 Making 14 for: 690365 Making 14 for: 6981 Making 15 for: 70270 Making 7 for: 7049 Making 6 for: 7075 Making 2 for: 7108 Making 12 for: 73000 Making 10 for: 73226 Making 14 for: 73247 Making 12 for: 733 Making 14 for: 73328 Making 10 for: 73341 Making 10 for: 73346 Making 9 for: 7350 Making 14 for: 7354 Making 12 for: 73540 Making 13 for: 7360 Making 7 for: 73717 Making 12 for: 7378 Making 10 for: 73834 Making 12 for: 73885 Making 14 for: 7389 Making 8 for: 7397 Making 12 for: 73975 Making 14 for: 7448 Making 12 for: 745 Making 12 for: 7453 Making 11 for: 7466 Making 12 for: 74835 Making 2 for: 74849 Making 14 for: 74892 Making 11 for: 74902 Making 12 for: 7501 Making 15 for: 75037 Making 12 for: 75093 Making 11 for: 75197 Making 10 for: 75204 Making 11 for: 75209 Making 6 for: 75301 Making 11 for: 7537 Making 12 for: 75412 Making 14 for: 75418

Making 11 for: 75420 Making 1 for: 75431 Making 12 for: 75616 Making 12 for: 75696 Making 10 for: 75738 Making 12 for: 7606 Making 5 for: 7630 Making 11 for: 7651 Making 10 for: 76535 Making 12 for: 76556 Making 8 for: 76604 Making 14 for: 76610 Making 12 for: 76639 Making 14 for: 76659 Making 7 for: 76706 Making 10 for: 76759 Making 14 for: 76843 Making 10 for: 76926 Making 6 for: 76931 Making 2 for: 76976 Making 12 for: 77066 Making 10 for: 77235 Making 12 for: 77359 Making 12 for: 775 Making 14 for: 7779 Making 5 for: 7799 Making 3 for: 7812 Making 8 for: 78130 Making 12 for: 78301 Making 12 for: 78359 Making 11 for: 78381 Making 12 for: 78415 Making 12 for: 78432 Making 14 for: 7850 Making 2 for: 78590 Making 10 for: 78698 Making 12 for: 78758 Making 2 for: 7878 Making 15 for: 78805 Making 14 for: 78813 Making 11 for: 78851 Making 12 for: 78855 Making 4 for: 78892 Making 11 for: 78951 Making 4 for: 78968 Making 12 for: 78992 Making 12 for: 79161 Making 13 for: 792

Making 12 for: 7921 Making 10 for: 7941 Making 3 for: 79713 Making 14 for: 79733 Making 9 for: 80089 Making 7 for: 80091 Making 7 for: 80135 Making 5 for: 80182 Making 10 for: 80254 Making 12 for: 80347 Making 14 for: 80365 Making 12 for: 80453 Making 14 for: 80463 Making 11 for: 80651 Making 14 for: 80664 Making 15 for: 80665 Making 12 for: 80687 Making 14 for: 80754 Making 10 for: 80763 Making 12 for: 80817 Making 6 for: 81171 Making 12 for: 81335 Making 12 for: 81423 Making 14 for: 81676 Making 4 for: 81713 Making 12 for: 81732 Making 12 for: 81814 Making 5 for: 81853 Making 6 for: 81860 Making 12 for: 81922 Making 14 for: 81978 Making 10 for: 82031 Making 10 for: 82046 Making 14 for: 8220 Making 15 for: 82261 Making 1 for: 82435 Making 10 for: 82649 Making 14 for: 82653 Making 14 for: 82658 Making 12 for: 8271 Making 12 for: 82718 Making 12 for: 82805 Making 14 for: 82841 Making 1 for: 82848 Making 4 for: 82880 Making 12 for: 82939 Making 12 for: 82986 Making 12 for: 83033

Making 11 for: 83288 Making 12 for: 83546 Making 12 for: 83603 Making 4 for: 83679 Making 12 for: 83702 Making 14 for: 8376 Making 12 for: 83825 Making 9 for: 83827 Making 14 for: 83867 Making 14 for: 83935 Making 4 for: 83939 Making 12 for: 83991 Making 10 for: 84105 Making 14 for: 8417 Making 11 for: 84402 Making 12 for: 84426 Making 10 for: 84541 Making 12 for: 84596 Making 11 for: 8462 Making 12 for: 84693 Making 11 for: 84847 Making 10 for: 84912 Making 10 for: 84927 Making 12 for: 85373 Making 8 for: 85475 Making 12 for: 85511 Making 3 for: 85576 Making 14 for: 85676 Making 12 for: 85714 Making 12 for: 85862 Making 14 for: 85953 Making 9 for: 85958 Making 13 for: 86002 Making 12 for: 86109 Making 12 for: 8629 Making 12 for: 86317 Making 7 for: 86326 Making 12 for: 86330 Making 12 for: 86357 Making 12 for: 86397 Making 10 for: 86412 Making 12 for: 86436 Making 3 for: 86452 Making 13 for: 86588 Making 3 for: 86614 Making 15 for: 86694 Making 15 for: 86709 Making 11 for: 86720

Making 2 for: 8675 Making 9 for: 86820 Making 14 for: 86836 Making 2 for: 86959 Making 12 for: 87023 Making 2 for: 87034 Making 10 for: 8708 Making 13 for: 8717 Making 14 for: 87236 Making 14 for: 87435 Making 11 for: 87438 Making 6 for: 87446 Making 12 for: 87492 Making 14 for: 87576 Making 12 for: 87643 Making 13 for: 87806 Making 10 for: 87962 Making 9 for: 87986 Making 6 for: 88061 Making 14 for: 8821 Making 14 for: 88256 Making 1 for: 88262 Making 10 for: 88389 Making 6 for: 88427 Making 9 for: 88446 Making 13 for: 88473 Making 9 for: 88551 Making 12 for: 88560 Making 10 for: 88657 Making 10 for: 88671 Making 12 for: 88719 Making 13 for: 88904 Making 12 for: 89002 Making 15 for: 89062 Making 15 for: 89105 Making 14 for: 89254 Making 12 for: 89371 Making 6 for: 89372 Making 12 for: 89378 Making 13 for: 89382 Making 7 for: 89424 Making 14 for: 89451 Making 6 for: 89460 Making 13 for: 89474 Making 11 for: 89607 Making 7 for: 89627 Making 10 for: 89659 Making 15 for: 89725

Making 12 for: 89833 Making 12 for: 89893 Making 10 for: 89923 Making 13 for: 89987 Making 12 for: 90038 Making 15 for: 9007 Making 10 for: 90173 Making 12 for: 90182 Making 14 for: 90185 Making 7 for: 9021 Making 1 for: 90344 Making 3 for: 90374 Making 10 for: 90710 Making 12 for: 90777 Making 14 for: 90820 Making 9 for: 90827 Making 12 for: 90860 Making 15 for: 90879 Making 3 for: 90922 Making 10 for: 91079 Making 10 for: 91129 Making 12 for: 91157 Making 10 for: 91273 Making 10 for: 91293 Making 6 for: 9136 Making 13 for: 91368 Making 2 for: 9137 Making 13 for: 91383 Making 8 for: 91459 Making 14 for: 91477 Making 8 for: 91520 Making 13 for: 91553 Making 5 for: 91611 Making 12 for: 91650 Making 12 for: 9169 Making 12 for: 91790 Making 14 for: 91803 Making 10 for: 91842 Making 6 for: 91861 Making 7 for: 91883 Making 10 for: 91895 Making 12 for: 91944 Making 1 for: 9198 Making 8 for: 92015 Making 14 for: 92105 Making 3 for: 92133 Making 14 for: 92215 Making 8 for: 9306

Making 12 for: 9332 Making 3 for: 9343 Making 6 for: 93710 Making 10 for: 93731 Making 14 for: 93737 Making 14 for: 93803 Making 13 for: 93849 Making 14 for: 93941 Making 15 for: 93998 Making 12 for: 94067 Making 12 for: 94198 Making 14 for: 94313 Making 11 for: 945 Making 5 for: 9462 Making 13 for: 9504 Making 11 for: 9546 Making 11 for: 95461 Making 12 for: 95500 Making 13 for: 9555 Making 12 for: 95605 Making 15 for: 95682 Making 12 for: 95792 Making 6 for: 95993 Making 6 for: 9600 Making 4 for: 96100 Making 12 for: 96216 Making 13 for: 96314 Making 10 for: 9639 Making 12 for: 96454 Making 12 for: 9664 Making 6 for: 96660 Making 14 for: 9676 Making 7 for: 96908 Making 10 for: 96955 Making 10 for: 97011 Making 9 for: 97138 Making 11 for: 97216 Making 10 for: 97246 Making 12 for: 9727 Making 2 for: 9732 Making 9 for: 97413 Making 14 for: 97437 Making 10 for: 9748 Making 12 for: 97571 Making 14 for: 97912 Making 15 for: 98336 Making 13 for: 98355 Making 12 for: 98510

```
Making 2 for: 98550
     Making 14 for: 98841
     Making 8 for: 99038
     Making 14 for: 9906
     Making 14 for: 99234
     Making 11 for: 99311
     Making 14 for: 9991
[22]: print(overSampled)
      overSampled.to_csv("oversampled.csv")
                 image_id hotel_id
     0
            000011648.jpg
                              15526
     1
            000011630.jpg
                              15526
     2
            000011650.jpg
                              15526
     3
            000011633.jpg
                              15526
            000011656.jpg
     4
                              15526
               9991x9.jpg
     40586
                               9991
     40587
                               9991
              9991x10.jpg
     40588
              9991x11.jpg
                               9991
     40589
              9991x12.jpg
                               9991
     40590
              9991x13.jpg
                               9991
     [40591 rows x 2 columns]
 []:
```