```
In [5]: import re
        TARGET SIZE = 96 #imports images of resolution 96x96
        '''change URLs to resize images to target size'''
        def overwrite urls(df):
            def reso overwrite(url tail, reso=TARGET SIZE):
                pattern = 's[0-9]+'
                search result = re.match(pattern, url tail)
                if search result is None:
                    return url tail
                else:
                    return 's{}'.format(reso)
            def join url(parsed url, s reso):
                parsed url[-2] = s reso
                return '/'.join(parsed url)
            df = df[df.url.apply(lambda x: len(x.split('/'))>1)]
            parsed url = df.url.apply(lambda x: x.split('/'))
            train url tail = parsed url.apply(lambda x: x[-2])
            resos = train url tail.apply(lambda x: reso overwrite(x, reso=TARGE
        T SIZE))
            overwritten df = pd.concat([parsed url, resos], axis=1)
            overwritten df.columns = ['url', 's reso']
            df['url'] = overwritten df.apply(lambda x: join url(x['url'], x['s
        reso']), axis=1)
            return df
        data sample resize = overwrite_urls(data_sample)
        print ('1. URLs overwritten')
        '''Split to test and train'''
        data test = pd.DataFrame(columns = ['id', 'url', 'landmark id'])
        data training all = pd.DataFrame(columns = ['id', 'url', 'landmark id'])
        percent test = 0.05
        import random
        random.seed(42)
        for landmark id in set(data sample resize['landmark id']):
            t = data sample resize[(data sample resize.landmark id == landmark
        id)] #get all images for a landmark id
            i = 0
            r =[]
            #print(len(t.id))
            while i < len(t.id) and i < 6000:
                r.append(t.id.iloc[it]) #create a list of all these images
                i += 1
            test = random.sample(r,int(percent test*len(r))) #randomly pick a s
        ample of 1% images from list 'r'
            training = list(set(r) - set(test)) #get the remaining images
            data t = data sample resize[data sample resize.id.isin(test)] #hold
```

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```
out dataset
            data tr = data sample resize[data sample resize.id.isin(training)]
        #training dataset
            data test = data test.append(data t)
            data training all = data training all.append(data tr)
        print ('2. train and test set created')
        '''Split into train and validation set'''
        data valid = pd.DataFrame(columns = ['id', 'url', 'landmark id'])
        data train = pd.DataFrame(columns = ['id', 'url', 'landmark id'])
        percent validation = 0.2 #takes 20% from each class as holdout data
        import random
        random.seed(42)
        for landmark id in set(data training all['landmark id']):
            t = data training all[(data training all.landmark id == landmark i
        d)]
            i = 0
            r =[]
            while i < len(t.id):</pre>
                it = i
                r.append(t.id.iloc[it])
                i += 1
            valid = random.sample(r,int(percent validation*len(r)))
            train = list(set(r) - set(valid))
            data v = data training all[data training all.id.isin(valid)]
            data t = data training all[data training all.id.isin(train)]
            data valid = data valid.append(data v)
            data train = data train.append(data t)
            n+=1
        print ('3. train and validation set created')
        1. URLs overwritten
        2. train and test set created
        3. train and validation set created
In [ ]: | train sample=data train.to csv()
        test sample=data test.to csv()
        valdi sample=data test.to csv()
```

Create directories 'train\_images\_model', 'validation\_images\_model', 'test\_images\_from\_train' before running the code ahead.

```
In [ ]: def fetch image(path, folder):
            try:
                url=path
                response=requests.get(url, stream=True)
                with open(folder + '/image.jpg', 'wb') as out file:
                    shutil.copyfileobj(response.raw, out file)
                del response
            except:
                print("error")
        '''TRAIN SET - fetch images for the resized URLs and save in the alread
        y created directory train images model'''
        i=0
        for link in data train['url']:
            if i%10000==0:
                print(i)
            #looping over links to get images
            if os.path.exists('train images model/'+str(data train['id'].iloc
        [i])+'.jpg'):
                i+=1
                print(i)
                continue
            fetch image(link,'train images model')
                os.rename('train images model/image.jpg','train images model/'+
        str(data train['id'].iloc[i])+ '.jpg')
            except:
                print("not found")
            i+=1
             if(i==50): #uncomment to test in your machine
                 break
        print('4. train images fetched')
        for link in data valid['url']:
                                                    #looping over links to get
        images
            if os.path.exists('validation images model/'+str(data valid['id'].i
        loc[i])+'.jpg'):
                i+=1
                continue
            fetch image(link, 'validation images model')
                os.rename('validation images model/image.jpg','validation image
        s model/'+ str(data valid['id'].iloc[i])+ '.jpg')
            except:
                print("not found")
            i+=1
             if (i==50): #uncomment to test in your machine
                  break
        print('5. Validation images fetched')
        i=0
        for link in data test['url']:
                                                   #looping over links to get i
            if os.path.exists('test images from train/'+str(data test['id'].ilo
        c[i])+'.jpg'):
                i+=1
```

```
continue
fetch_image(link,'test_images_from_train')
try:
    os.rename('test_images_from_train/image.jpg','test_images_from_
train/'+ str(data_test['id'].iloc[i])+ '.jpg')
except:
    print("not found")
i+=1
# if(i==50): #uncomment to test in your machine
# break
print('6. Test images_fetched')
```

## **Data Preprocessing**

Creating folders for each landmark ID (Class label)

```
In [ ]: | ##create folders for landmark IDs in Training folder
        import pandas as pd
        import os
        import shutil
        from shutil import copyfile
        import urllib
        train data = data train
        temp = pd.DataFrame(data train.landmark id.value counts())
        temp.reset index(inplace=True)
        temp.columns = ['landmark id','count']
        def createfolders(dataset, folder):
            i = 0
            while i < len(dataset):</pre>
                 landmark = str(dataset.landmark id.iloc[i])
                 path = folder + '/'+ landmark
                 if not os.path.exists(path):
                     os.makedirs(path)
                 i+=1
        createfolders(temp, 'train images model')
        available = [int((x[0].split('/'))[-1]) for x in os.walk(r'train images
         model/') if len((x[0].split('/'))[-1]) > 0]
        new = [str(x) \text{ for } x \text{ in } range(1000,6999) \text{ if } x \text{ not in } available]
        for i in new:
            path = 'train images model/' + i
            if not os.path.exists(path):
                 os.makedirs(path)
        print ('Train folders created')
        rootdirpics = r'train images model/'
        rootdirfolders = r'train images model/'
        def transformdata(data,path1, path2):
            n = 1
             for landmark id in set(data['landmark id']):
                 t = data[(data.landmark id == landmark id)]
                 i = 1
                 r = []
                 while i <= len(t.id):</pre>
                     it = i - 1
                     r.append(t.id.iloc[it])
                     i += 1
                 for files in os.listdir(rootdirpics): # loop through startfo
        1 ders
                     inpath = path1 + files
                     folder = str(landmark id)
                     outpath = path2 + folder
                     if ((files.split('.')[0] in r) & (os.path.getsize(inpath) >
        1000)):
                           print('move')
                         shutil.move(inpath, outpath)
                     elif ((files.split('.')[0] in r) & (os.path.getsize(inpath)
```

```
<= 1000):
                         os.remove(inpath)
                 n += 1
        transformdata(train data, rootdirpics, rootdirfolders)
        print ('Train images moved')
In [ ]: ##create folders for landmark IDs in Validation folder
        temp = pd.DataFrame(data valid.landmark id.value counts())
        temp.reset index(inplace=True)
        temp.columns = ['landmark id','count']
        createfolders(temp, 'validation images model')
        print ('Validation folders created')
         #make folders for landmark ID which had no images in validation sets -
        required for codes running next
        available = [int((x[0].split('/'))[-1]) for x in os.walk(r'validation i
        mages model/') if len((x[0].split('/'))[-1]) > 0]
        new = [str(x) \text{ for } x \text{ in } range(1000,6999) \text{ if } x \text{ not in } available]
        for i in new:
            path = 'validation images model/' + i
            if not os.path.exists(path):
                 os.makedirs(path)
        rootdirpics = r'validation images model/'
        rootdirfolders = r'validation images model/'
        transformdata(data valid, rootdirpics, rootdirfolders)
        print ('Validation images moved')
In [ ]: | #remove corrupted images from the dataset
        def cleaning(dir):
            i = 1000
            count = 0
            while i <= 6999:
                f = str(i)
                 print (f)
                 for root, dirs, files in os.walk(dir +'/'+ f): # loop through
         startfolders
                     for pic in files:
                         p=dir+'/'+f+'/'+pic
                         try:
                             im=Image.open(p)
                         except IOError:
                             count+=1
                             print(p)
                             os.remove(p)
                     i += 1
             print(count)
In [ ]: cleaning("/train images model")
        cleaning("/validation_images_model")
```