exploring_data

September 26, 2018

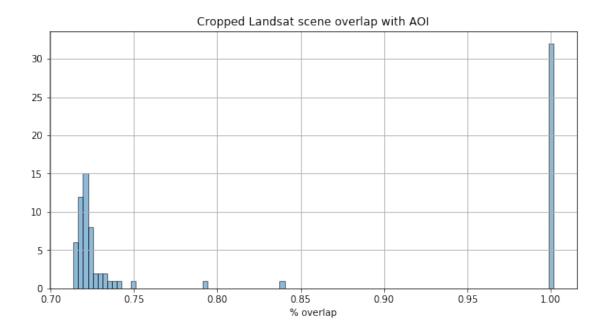
```
In [1]: import os, sys
       import numpy as np
       import rasterio as rio
       import boto3 as b3
       import matplotlib.pyplot as plt
       %matplotlib inline
In [2]: landsat_dl_dir = r'C:\projects\RD\south_africa\landsat\test'
       # create the folder if it doesn't exist
       if not os.path.exists(landsat_dl_dir):
           os.mkdir(landsat_dl_dir)
In [3]: # use boto3 to download the data
       s3_loc = 'earthlab-jmcglinchy/south-africa-landsat'
       s3_loc = 'earthlab-jmcglinchy'
       s3 = b3.resource('s3')
       my_bucket = s3.Bucket(s3_loc)
       s3, my_bucket
Out[3]: (s3.ServiceResource(), s3.Bucket(name='earthlab-jmcglinchy'))
In [4]: dl_objects = []
       for object in my_bucket.objects.all():
           if 'south-africa-landsat/L' in object.key:
               print(object)
               dl_objects.append(object)
s3.0bjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LC08168077201304
s3.0bjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LC08168077201306
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LCO8168077201306
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LC08168077201307
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LC08168077201308
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LC08168077201311
```

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s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LC08168077201403
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LC08168077201405
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LC08168077201405
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LC08168077201406
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LC08168077201406
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LC08168077201407
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LC08168077201408
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LC08168077201408
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LC08168077201409
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LC08168077201410
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LC08168077201412
s3.0bjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077200701
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077200701
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077200703
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077200704
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077200705
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077200705
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077200708
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077200709
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077200709
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077200710
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077200804
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077200805
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077200808
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077200808
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077200809
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077200811
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077200903
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077200904
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201001
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201002
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s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201006
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201007
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201104
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201106
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201106
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201108
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201205
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201207
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201207
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201208
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201209
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201210
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE071680772012119
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201301
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201304
```

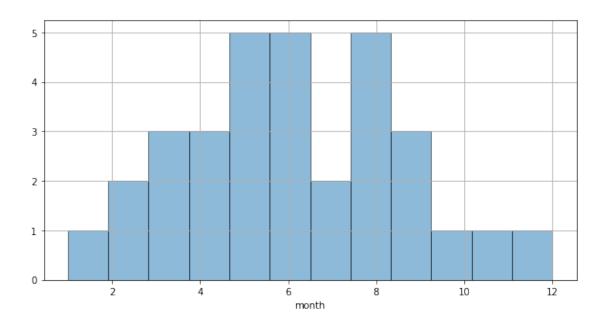
```
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201305
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201305
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201309
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201310
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201312
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201401
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201402
{\tt s3.0bjectSummary(bucket\_name='earthlab-jmcglinchy', key='south-africa-landsat/LE071680772014038)} \\
s3.0bjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201406
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201406
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201407
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201408
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201409
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201409
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LE07168077201410
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LT05168077200702
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LT05168077200705
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LT05168077200706
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LT05168077200708
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LT05168077200802
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LT05168077200804
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LT05168077200808
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LT05168077200809
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LT05168077200809
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LT05168077200903
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LT05168077200904
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LT05168077200905
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LT05168077201001
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LT05168077201004
s3.ObjectSummary(bucket_name='earthlab-jmcglinchy', key='south-africa-landsat/LT05168077201103
In [5]: sample_obj = dl_objects[0]
        # workflow for downloading the object, unzipping, extracting sr_ndvi.tif, and deleting
        ## first download
        # key base = os.path.basename(sample obj.key)
        # local_key_name = os.path.join(landsat_dl_dir, key_base)
        # s3.Bucket(s3_loc).download_file(sample_obj.key, local_key_name)
In [6]: ## use tarfile to get the sr_ndvi.tif file
        import tarfile
        def sr_tif_files(members):
            for tarinfo in members:
                # if os.path.splitext(tarinfo.name)[1] == ".py":
                #print(tarinfo.name)
```

```
if tarinfo.name.split('.tif')[0].split('_')[-1] == 'ndvi':
                    yield tarinfo
        # tar = tarfile.open(local_key_name)
        # tar.extractall(path=landsat dl dir, members=sr tif files(tar))
        # tar.close()
        # # delete local_key_name file (.tar.gz)
        # os.remove(local key name)
In [7]: def dl_extract_ndvi_tif(sample_obj, landsat_dl_dir):
           key_base = os.path.basename(sample_obj.key)
            local_key_name = os.path.join(landsat_dl_dir, key_base)
            s3.Bucket(s3_loc).download_file(sample_obj.key, local_key_name)
            tar = tarfile.open(local key name)
            tar.extractall(path=landsat_dl_dir, members=sr_tif_files(tar))
            tar.close()
            # delete local_key_name file (.tar.qz)
            return os.remove(local_key_name)
        # only do this if it hasn't been done
        if not os.path.exists(landsat_dl_dir):
            for i,sample_obj in enumerate(dl_objects[1:]):
                print('on file {} of {}'.format(i+1, len(dl_objects) - 1))
                dl_extract_ndvi_tif(sample_obj, landsat_dl_dir)
In [8]: # extract raster data for an AOI
        import geopandas as gpd
        shpfile = '../bounding box/minbound10k WGS84.shp'
        shp = gpd.read_file(shpfile)
        bounds = shp['geometry'][0].bounds
       bounds
Out[8]: (31.01958199302162,
        -25.068105363674974,
         31.535826264860678,
         -24.63766714051666)
In [9]: # need to project the geometry to that of the rasters
        # create a list of the sr_ndvi.tif files
        from glob import glob
        tif_dir = '../landsat/test'
```

```
tif_list = sorted(glob(tif_dir + "/*.tif"))
        with rio.open(tif_list[0]) as src:
            landsat_crs = src.crs
        shp_utm = shp.to_crs(landsat_crs)
        geom = shp_utm['geometry'][0]
In [10]: # with the shapefile in UTM, extract the pixels
         from rasterio.mask import mask
         overlap_list = []
         high_overlap_names = []
         overlap_t = 0.9 # only record files with overlap of ADI > threshold
         for tif in tif_list:
             with rio.open(tif) as src:
                 arr, m_tf = mask(src, [geom.__geo_interface__], all_touched=True, crop=True, :
                 arr = np.ma.masked_equal(arr, -9999)
                 #print(arr.shape)
                 m_tf_area = m_tf.a * m_tf.a * arr.count()
                 overlap_area = m_tf_area / geom.area
                 #print(overlap_area)
                 overlap_list.append(overlap_area)
                 if overlap_area > 0.9:
                     high_overlap_names.append(tif)
In [11]: plt.figure(figsize=(10,5))
        plt.hist(overlap_list, bins=100, alpha=0.5, edgecolor='k');
        plt.title('Cropped Landsat scene overlap with AOI')
         plt.xlabel('% overlap')
        plt.grid()
```



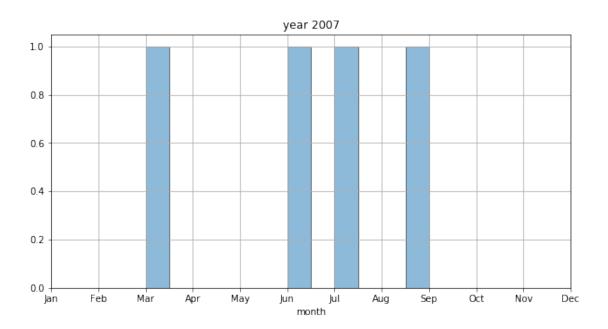
```
In [12]: os.path.basename(high_overlap_names[0]).split('_')[3]
         years = []
         months = []
         for hon in high_overlap_names:
             acq_date = os.path.basename(hon).split('_')[3]
             year = int(acq_date[:4])
             years.append(year)
             month = int(acq_date[4:6])
             months.append(month)
         print(set(years))
        print(set(months))
{2007, 2008, 2009, 2010, 2011, 2013, 2014}
{1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11, 12}
In [13]: plt.figure(figsize=(10,5))
        plt.grid()
        plt.hist(months, bins=12, alpha=0.5, edgecolor='k');
         plt.title('')
        plt.xlabel('month')
Out[13]: Text(0.5,0,'month')
```

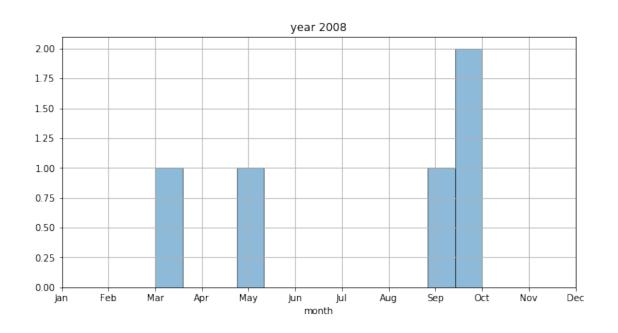


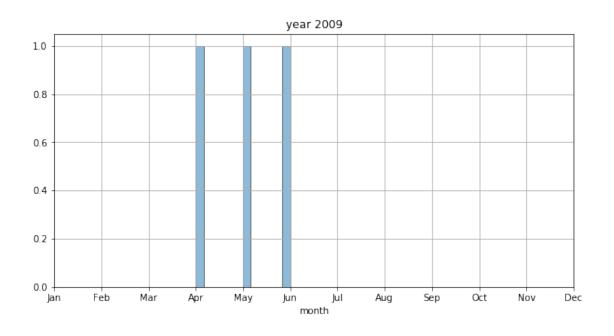
```
In [14]: month_labels = ('Jan', 'Feb', 'Mar', 'Apr', 'May', 'Jun', 'Jul', 'Aug', 'Sep', 'Oct',
         for yr in set(years):
             year_months = []
             d = {key: 0 for key in month_labels} # try a dictionary
             for hon in high_overlap_names:
                 acq_date = os.path.basename(hon).split('_')[3]
                 year = int(acq_date[:4])
                 if yr == year:
                     month = int(acq_date[4:6])
                     year_months.append(month)
                     k = month_labels[month-1]
                     d[k] += 1
             plt.figure(figsize=(10,5))
             plt.grid()
             plt.hist(year_months, bins=12, alpha=0.5, edgecolor='k');
               hist, bins = np.histogram(year_months, bins=np.arange(1,14))
               plt.bar(hist, np.arange(1, 13));
             plt.xticks(np.arange(12), month_labels)
             plt.title('year {}'.format(yr))
             plt.xlabel('month')
```

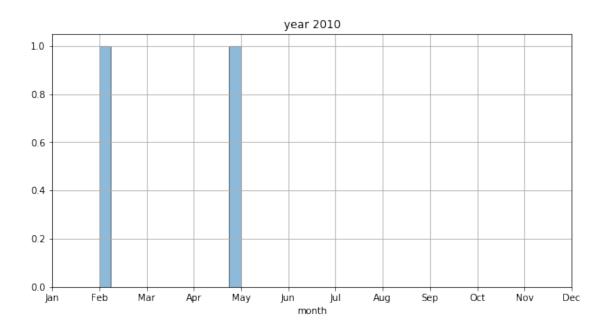
print(yr, d)

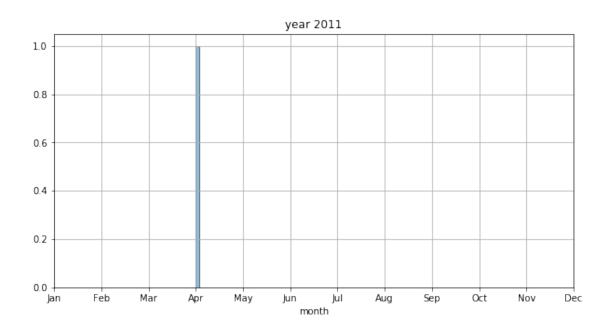
```
2007 {'Jan': 0, 'Feb': 1, 'Mar': 0, 'Apr': 0, 'May': 1, 'Jun': 1, 'Jul': 0, 'Aug': 1, 'Sep': 0 2008 {'Jan': 0, 'Feb': 1, 'Mar': 0, 'Apr': 1, 'May': 0, 'Jun': 0, 'Jul': 0, 'Aug': 1, 'Sep': 2 2009 {'Jan': 0, 'Feb': 0, 'Mar': 1, 'Apr': 1, 'May': 1, 'Jun': 0, 'Jul': 0, 'Aug': 0, 'Sep': 0 2010 {'Jan': 1, 'Feb': 0, 'Mar': 0, 'Apr': 1, 'May': 0, 'Jun': 0, 'Jul': 0, 'Aug': 0, 'Sep': 0 2011 {'Jan': 0, 'Feb': 0, 'Mar': 1, 'Apr': 0, 'May': 0, 'Jun': 0, 'Jul': 0, 'Aug': 0, 'Sep': 0 2013 {'Jan': 0, 'Feb': 0, 'Mar': 1, 'Apr': 0, 'May': 1, 'Jun': 2, 'Jul': 1, 'Aug': 1, 'Sep': 0 2014 {'Jan': 0, 'Feb': 0, 'Mar': 1, 'Apr': 0, 'May': 2, 'Jun': 2, 'Jul': 1, 'Aug': 2, 'Sep': 1
```

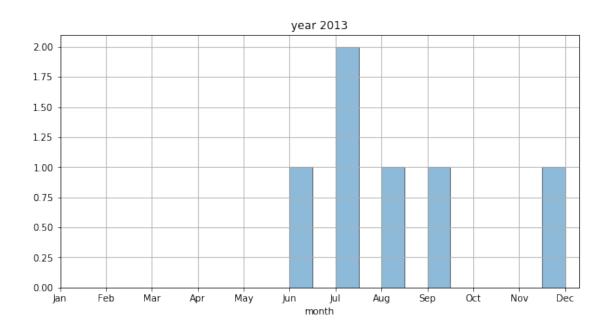


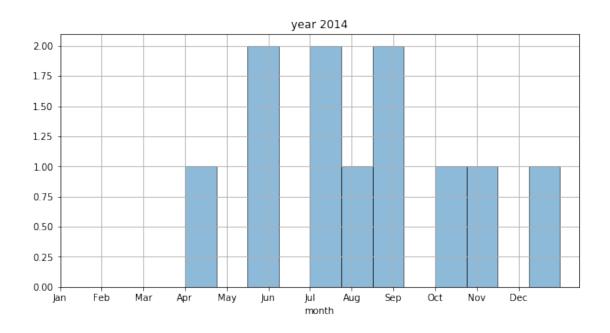




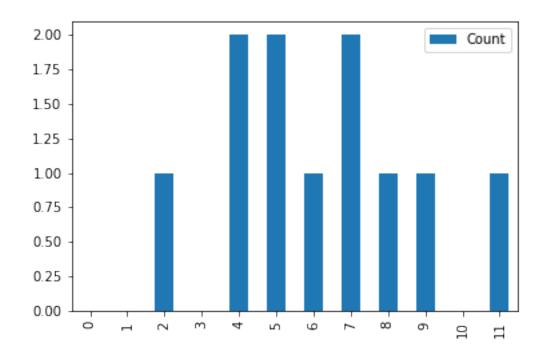








Out[15]: <matplotlib.axes._subplots.AxesSubplot at 0x133a1347d30>



0.1 look at all scenes regardless of overlap

```
In [16]: overlap_list = []
        high_overlap_names = []
         overlap_t = 0.5 # only record files with overlap of AOI > threshold
         for tif in tif_list:
             with rio.open(tif) as src:
                 arr, m_tf = mask(src, [geom.__geo_interface__], all_touched=True, crop=True, :
                 arr = np.ma.masked_equal(arr, -9999)
                 #print(arr.shape)
                 m_tf_area = m_tf.a * m_tf.a * arr.count()
                 overlap_area = m_tf_area / geom.area
                 #print(overlap_area)
                 overlap_list.append(overlap_area)
                 if overlap_area > overlap_t:
                     high_overlap_names.append(tif)
         years = []
         months = []
         for hon in high_overlap_names:
             acq_date = os.path.basename(hon).split('_')[3]
             year = int(acq_date[:4])
             years.append(year)
             month = int(acq_date[4:6])
             months.append(month)
         print(set(years))
         print(set(months))
         month_labels = ('Jan', 'Feb', 'Mar', 'Apr', 'May', 'Jun', 'Jul', 'Aug', 'Sep', 'Oct',
         for yr in set(years):
             year_months = []
             d = {key: 0 for key in month_labels} # try a dictionary
             for hon in high_overlap_names:
                 acq_date = os.path.basename(hon).split('_')[3]
                 year = int(acq_date[:4])
                 if yr == year:
                     month = int(acq_date[4:6])
                     year_months.append(month)
                     k = month_labels[month-1]
                     d[k] += 1
             plt.figure(figsize=(10,5))
```

```
plt.grid()
            plt.hist(year_months, bins=12, alpha=0.5, edgecolor='k');
               hist, bins = np.histogram(year_months, bins=np.arange(1,14))
               plt.bar(hist, np.arange(1, 13));
            plt.xticks(np.arange(12), month_labels)
             plt.title('year {}'.format(yr))
            plt.xlabel('month')
            print(yr, d)
{2007, 2008, 2009, 2010, 2011, 2012, 2013, 2014}
{1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11, 12}
2007 {'Jan': 2, 'Feb': 1, 'Mar': 1, 'Apr': 1, 'May': 3, 'Jun': 1, 'Jul': 0, 'Aug': 2, 'Sep': 2
2008 {'Jan': 0, 'Feb': 2, 'Mar': 0, 'Apr': 2, 'May': 1, 'Jun': 0, 'Jul': 0, 'Aug': 3, 'Sep': 3
2009 {'Jan': 0, 'Feb': 0, 'Mar': 2, 'Apr': 2, 'May': 1, 'Jun': 0, 'Jul': 0, 'Aug': 0, 'Sep': 0
2010 {'Jan': 2, 'Feb': 1, 'Mar': 0, 'Apr': 1, 'May': 0, 'Jun': 2, 'Jul': 1, 'Aug': 0, 'Sep': 0
2011 {'Jan': 0, 'Feb': 0, 'Mar': 1, 'Apr': 1, 'May': 0, 'Jun': 2, 'Jul': 0, 'Aug': 1, 'Sep': 0
2012 {'Jan': 0, 'Feb': 0, 'Mar': 0, 'Apr': 0, 'May': 1, 'Jun': 0, 'Jul': 2, 'Aug': 1, 'Sep': 1
2013 {'Jan': 1, 'Feb': 0, 'Mar': 0, 'Apr': 2, 'May': 3, 'Jun': 2, 'Jul': 1, 'Aug': 1, 'Sep': 1
2014 {'Jan': 1, 'Feb': 1, 'Mar': 2, 'Apr': 0, 'May': 2, 'Jun': 4, 'Jul': 2, 'Aug': 3, 'Sep': 3
```

