```
# import the necessary packages
import cv2
import numpy as np
import matplotlib.pyplot as plt
from skimage.io import imread, imshow
from random import randrange
# Geocoding Exif Image Metadata
pip install Pillow
     Requirement already satisfied: Pillow in /usr/local/lib/python3.7/dist-packages (7.1.2)
from PIL import Image
import os
import requests
from io import BytesIO
#!/usr/bin/env python
from PIL import Image
def get exif(filename):
   image = Image.open(filename)
   image.verify()
   return image._getexif()
exif1 = get_exif(r'/content/IX-11-01917_0004_0001.JPG')
exif2 = get_exif(r'/content/IX-11-01917_0004_0002.JPG')
print(exif1)
print(exif2)
     {36864: b'0230', 37378: (497, 100), 36867: '2018:09:02 05:23:42', 37380: (0, 10), 37381
     {36864: b'0230', 37378: (497, 100), 36867: '2018:09:02 05:23:47', 37380: (0, 10), 37381
from PIL.ExifTags import TAGS
def get labeled exif(exif):
   labeled = {}
   for (key, val) in exif.items():
        labeled[TAGS.get(key)] = val
   return labeled
```

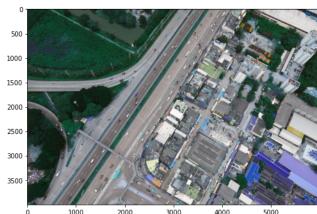
```
exif1 = get_exif(r'/content/IX-11-01917_0004_0001.JPG')
labeled1 = get labeled exif(exif1)
print(labeled1)
exif2 = get exif(r'/content/IX-11-01917 0004 0002.JPG')
labeled2 = get labeled exif(exif2)
print(labeled2)
     {'ExifVersion': b'0230', 'ApertureValue': (497, 100), 'DateTimeOriginal': '2018:09:02 05
     {'ExifVersion': b'0230', 'ApertureValue': (497, 100), 'DateTimeOriginal': '2018:09:02 0'
from PIL.ExifTags import GPSTAGS
def get_geotagging(exif):
    if not exif:
        raise ValueError("No EXIF metadata found")
    geotagging = {}
    for (idx, tag) in TAGS.items():
        if tag == 'GPSInfo':
            if idx not in exif:
                raise ValueError("No EXIF geotagging found")
            for (key, val) in GPSTAGS.items():
                if key in exif[idx]:
                    geotagging[val] = exif[idx][key]
    return geotagging
exif1 = get exif(r'/content/IX-11-01917 0004 0001.JPG')
geotags1 = get_geotagging(exif1)
print(geotags1)
exif2 = get_exif(r'/content/IX-11-01917_0004_0002.JPG')
geotags2 = get geotagging(exif2)
print(geotags2)
     {'GPSVersionID': b'\x02\x03\x00\x00', 'GPSLatitudeRef': 'N', 'GPSLatitude': ((14, 1), (3, 1), (3, 1))}
     {'GPSVersionID': b'\x02\x03\x00\x00', 'GPSLatitudeRef': 'N', 'GPSLatitude': ((14, 1), (3
def get decimal from dms(dms, ref):
    degrees = dms[0][0] / dms[0][1]
    minutes = dms[1][0] / dms[1][1] / 60.0
    seconds = dms[2][0] / dms[2][1] / 3600.0
    if ref in ['S', 'W']:
        degrees = -degrees
        minutes = -minutes
```

seconds = -secondsreturn round(degrees + minutes + seconds, 5) def get coordinates(geotags): lat = get_decimal_from_dms(geotags['GPSLatitude'], geotags['GPSLatitudeRef']) lon = get decimal from dms(geotags['GPSLongitude'], geotags['GPSLongitudeRef']) return (lat, lon) exif1 = get exif(r'/content/IX-11-01917 0004 0001.JPG') geotags1 = get geotagging(exif1) print(get coordinates(geotags1)) exif2 = get exif(r'/content/IX-11-01917 0004 0002.JPG') geotags2 = get_geotagging(exif2) print(get coordinates(geotags2)) (14.06462, 100.61807) (14.06506, 100.61807) import sys from PIL import Image for filename in sys.argv[1:]: print(filename) image1 = Image.open(r'/content/IX-11-01917 0004 0001.JPG') image clean1 = Image.new(image1.mode, image1.size) image_clean.putdata(list(image1.getdata())) image_clean.save('clean_' + r'IX-11-01917_0004_0001.JPG') image2 = Image.open(r'/content/IX-11-01917 0004 0002.JPG') image clean2 = Image.new(image2.mode, image2.size) image clean.putdata(list(image2.getdata())) image_clean.save('clean_' + r'IX-11-01917_0004_0002.JPG') -f /root/.local/share/jupyter/runtime/kernel-843e5d57-ef80-480e-aa82-b6e6905e7403.json #Reading the Images image1 = cv2.imread('/content/IX-11-01917 0004 0001.JPG') image2 = cv2.imread('/content/IX-11-01917 0004 0002.JPG') figure, ax = plt.subplots(1, 2, figsize=(18, 8)) ax[0].imshow(image1)

ax[1].imshow(image2)

<matplotlib.image.AxesImage at 0x7fe1b86f65d0>





```
#Resizing of Images
image1 = cv2.resize(image1, (0,0), fx=1, fy=1)
image2 = cv2.resize(image2, (0,0), fx=1, fy=1)
```

```
!pip install opencv-python==3.4.2.17
!pip3 install opencv-contrib-python==3.4.2.17
```

Requirement already satisfied: opencv-python==3.4.2.17 in /usr/local/lib/python3.7/dist-Requirement already satisfied: numpy>=1.14.5 in /usr/local/lib/python3.7/dist-packages (Requirement already satisfied: opencv-contrib-python==3.4.2.17 in /usr/local/lib/python3.7/dist-packages (Requirement already satisfied: numpy>=1.14.5 in /usr/local/lib/python3.7/dist-packages (Requ

#Feature Extraction - KeyPoints

#Using BRISK for defining Key points and descriptors for each image
brisk = cv2.BRISK_create()

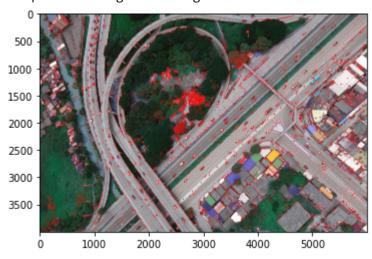
```
# find the keypotnts and descriptors with BRISK
kp1, des1 = brisk.detectAndCompute(image1,None)
kp2, des2 = brisk.detectAndCompute(image2,None)
```

print('No.of key points in image1: ',len(kp1), '\n No.of key points in image2: ',len(kp2))

No.of key points in image1: 107414 No.of key points in image2: 143639

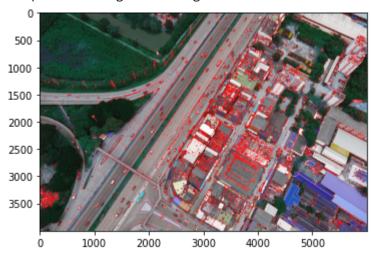
Visulaizing Point Clouds
img1 = cv2.drawKeypoints(image1, kp1, outImage = None, color=(255,0,0))
plt.imshow(img1)

<matplotlib.image.AxesImage at 0x7fe1b87896d0>



img2 = cv2.drawKeypoints(image2, kp2, outImage = None, color=(255,0,0))
plt.imshow(img2)

<matplotlib.image.AxesImage at 0x7fe1b84efd10>



#Feature Matching

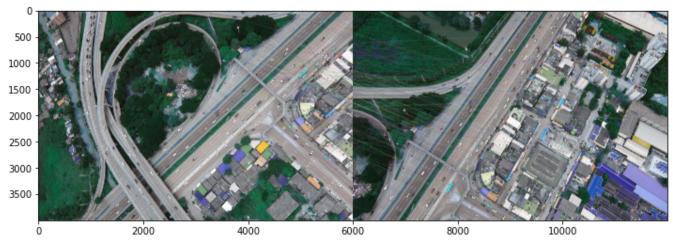
#Using Brute Force Matches, KNN (Keeping value as 2 since we are applying for 2 images) bf = cv2.BFMatcher() matches = bf.knnMatch(des1,des2, k=2)

Apply ratio test

```
good = []
for m in matches:
    if m[0].distance < 0.5*m[1].distance:
        good.append(m)
matches = np.asarray(good)

New_img = cv2.drawMatchesKnn(image1,kp1,image2,kp2,good,None,flags = cv2.DrawMatchesFlags_NOT_
plt.figure(figsize=[12,6])
plt.imshow(New_img)</pre>
```

<matplotlib.image.AxesImage at 0x7fe1b84a4e10>



```
imMatches = None
MAX_FEATURES = 500
GOOD_MATCH_PERCENT = 0.15

def alignImages(image1, image2):

    # Detect ORB features and compute descriptors.
    orb = cv2.ORB_create (MAX_FEATURES)
    keypoints1, descriptors1 = orb.detectAndCompute(image1, None)
    keypoints2, descriptors2 = orb.detectAndCompute(image2, None)

# match features
matcher = cv2.DescriptorMatcher_create(cv2.DESCRIPTOR_MATCHER_BRUTEFORCE_HAMMING)
matches = matcher.match(descriptors1, descriptors2, None)

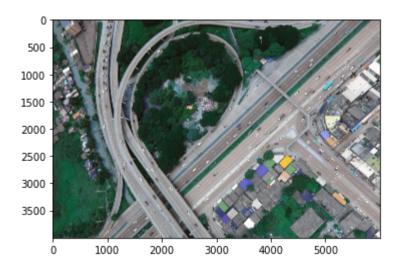
# Sort matches by score
matches.sort(key=lambda x: x.distance, reverse=False)

# Remove not so good matches
```

numGoodMatches = int(len(matches) * GOOD_MATCH_PERCENT)

plt.imshow(fixing);

```
matches = matches[:numGoodMatches]
 # Draw top matches
 global imMatches
  imMatches = cv2.drawMatches(image1, keypoints1, image2, keypoints2, matches, None)
 # Extract location of good matches
 points1 = np.zeros((len(matches), 2), dtype=np.float32)
 points2 = np.zeros((len(matches), 2), dtype=np.float32)
 for i, match in enumerate (matches):
   points1[i, :] = keypoints1[match.queryIdx].pt
   points2[i, :] = keypoints2[match.trainIdx].pt
 # Find homogrophy
 h, mask = cv2.findHomography(points1, points2, cv2.RANSAC) # using RANSAC
 # Use homography
 height, width, channels = image2.shape
 im1Reg = cv2.warpPerspective(image1, h, (width, height))
 return im1Reg, h
#Read the image for reference
```



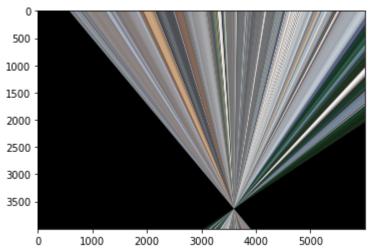
read the image to be aligned
align = cv2.imread('/content/IX-11-01917_0004_0002.JPG', cv2.IMREAD_COLOR)
plt.imshow(align);

fixing = cv2.imread('/content/IX-11-01917 0004 0001.JPG', cv2.IMREAD COLOR)



ImReg, h = alignImages(align, fixing)
plt.imshow(ImReg)

<matplotlib.image.AxesImage at 0x7fe1b69b47d0>



print("The estimated homography is: \n",h)

```
The estimated homography is:

[[-4.52871146e-01 -6.85640068e-01 3.59720198e+03]

[-4.56890949e-01 -6.91575707e-01 3.62850141e+03]

[-1.25911405e-04 -1.90585596e-04 1.00000000e+00]]
```

#Visualizing the matches
plt.imshow(imMatches)

<matplotlib.image.AxesImage at 0x7fe1b8447190>



✓ 0s completed at 00:09

×