X2.append(X[item][0]) Y2.append(X[item][1])

plt.plot(X2,Y2,'o',color='r',label="Outliers")

circle = plt.Circle((points[0],points[1]),points[2],fill=False,color='g',label="RANSAC") circle2=plt.Circle((BF[0],BF[1]),BF[2],fill=False,color='purple',label="Best Sample")

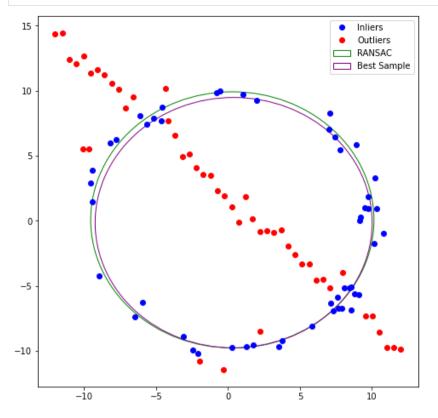
Index No - 190095C

GitHub repository - https://github.com/Pasindu-Manodara/Image-Processing.git

Question 1

```
In [308...
                  import random
                  def RadiusAndCenter(randomPoints):
                         # taking 3 points
                         A_c =X[randomPoints[0]]
                         B_c = X[randomPoints[1]]
                         C_c = X[randomPoints[2]]
                         middle\_AB = \left[ (A\_c[0] + B\_c[0])/2, (A\_c[1] + B\_c[1])/2 \right] \# take the middle point on AB line
                         \label{eq:middle_BC} \mbox{middle_BC} = \mbox{[(B_c[0]+C_c[0])/2,(B_c[1]+C_c[1])/2]} \mbox{ \# take the middle point on BC line} \\ \mbox{line} \mbox{middle_BC} = \mbox{[(B_c[0]+C_c[0])/2,(B_c[1]+C_c[1])/2]} \mbox{ \# take the middle point on BC line} \\ \mbox{line} \mbox{[(B_c(0)+C_c[0])/2,(B_c(1)+C_c[1])/2]} \mbox{ \# take the middle point on BC line} \\ \mbox{[(B_c(0)+C_c[0])/2,(B_c(1)+C_c[1])/2]} \mbox{ \# take the middle point on BC line} \\ \mbox{[(B_c(0)+C_c[0])/2,(B_c(1)+C_c[1])/2]} \mbox{ \# take the middle point on BC line} \\ \mbox{[(B_c(0)+C_c[0])/2,(B_c(1)+C_c[1])/2]} \mbox{ \# take the middle point on BC line} \\ \mbox{[(B_c(0)+C_c[0])/2,(B_c(1)+C_c[1])/2]} \mbox{ \# take the middle point on BC line} \\ \mbox{[(B_c(0)+C_c[0])/2,(B_c(1)+C_c[0])/2]} \mbox{[(B_c(0)+C_c[0])/2,(B_c(1)+C_c[0])/2]} \\ \mbox{[(B_c(0)+C_c[0])/2,(B_c(1)+C_c[0])} \\ \mbox{[(B_c(0)+C_c[0])/2,(B_c(1)+C_c[0])/2]} \\ \mbox{[(B_c(0)+C_c[0])/2,(B_c(1)+C_c[0])/2]} \\ \mbox{[(B_c(0)+C_c[0])/2,(B_c(1)+C_c[0])} \\ \mbox{[(B_c(0)+C_c[0])/2,(B_c(1)+
                         if (B_c[1]-A_c[1])!=0 and (C_c[1]-B_c[1])!=0:
                                AB\_perpendiular\_gradient = -(B\_c[0]-A\_c[0])/(B\_c[1]-A\_c[1]) \quad \# \ take \ the \ orthogonal \ line \ to \ AB \ and \ BC
                                BC_perpendiular_gradient = -(C_c[0]-B_c[0])/(C_c[1]-B_c[1])
                                AB_perpendiular_C = middle_AB[1]-AB_perpendiular_gradient*middle_AB[0]
                                BC_perpendiular_C = middle_BC[1]-BC_perpendiular_gradient*middle_BC[0]
                                \label{eq:center_X = (BC_perpendiular_C-AB_perpendiular_C)/(AB_perpendiular_gradient-BC_perpendiular_gradient)} \\
                                Center_Y = AB_perpendiular_gradient*Center_X + AB_perpendiular_C # compute center coordinates
                          elif (B_c[1]-A_c[1])==0:
                                BC\_perpendiular\_gradient = -(C\_c[0]-B\_c[0])/(C\_c[1]-B\_c[1])
                                BC_perpendiular_C = middle_BC[1]-BC_perpendiular_gradient*middle_BC[0]
                                Center X = (Center Y-BC perpendiular C)/BC perpendiular gradient
                          elif (C_c[1]-B_c[1])==0:
                                 AB\_perpendiular\_gradient = -(B\_c[0]-A\_c[0])/(B\_c[1]-A\_c[1])
                                AB_perpendiular_C = middle_AB[1]-AB_perpendiular_gradient*middle_AB[0]
                                Center Y = B c[1]
                                Center_X = (Center_Y-AB_perpendiular_C)/AB_perpendiular_gradient
                          return Center_X,Center_Y,radius
  In [1]:
                  def DistanceBW2Pts(pt1,pt2):
                         return ((pt2[1]-pt1[1])**2+(pt2[0]-pt1[0])**2)**0.5
In [312...
                  def ransac(P_list):
                         threshold =1
                         pointsList=[]
                         countlist = []
                         iterations = 35
                         for k in range(iterations):
                                count = 0
                                randomPoints = []
                                for i in range(3):
                                       randomPoints.append(random.randint(0,len(P_list)-1)) # take three random points
                                pointsList.append(randomPoints)
                                 for j in range(len(P_list)):
                                        """Check whether otherpoints are inliers"""
                                       if abs(DistanceBW2Pts(RadiusAndCenter(randomPoints)[0:2],P_list[j])-RadiusAndCenter(randomPoints)[2]) <= threshold:</pre>
                                               count+=1
                                countlist.append(count)
                         pt =RadiusAndCenter(pointsList[countlist.index(max(countlist))])
                         return pt
In [313...
                  points = ransac(X)
                  threshold = 1
                  inliers = []
                  for j in range(100):# compute inliers
                          if abs(DistanceBW2Pts(points[0:2],X[j])-points[2]) <= threshold:</pre>
                                inliers.append(j)
                  Outliers =[] #compute outliers
                         1 in range(100)
                         if i not in inliers:
                                Outliers.append(i)
                  bestFit = np.array([X[j] for j in inliers])
                  BF = ransac(bestFit)#compute best sample
In [323...
                  plt.figure(figsize=(8,8))
                  X1=[]
                  Y1=[]
                  for item in inliers:
                         X1.append(X[item][0])
                         Y1.append(X[item][1])
                  plt.plot(X1,Y1,'o',color='b',label="Inliers")
                  X2=[]
                  Y2=[]
                  for item in Outliers:
```

```
plt.gca().add_patch(circle)
plt.gca().add_patch(circle2)
plt.legend()
plt.show()
```

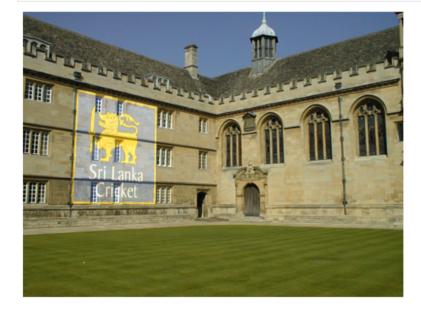


Discussion

In Question 1, what I have done is that took any random three points and make a circle which goes through that three points. Then I have calculated the radius and the Center coordinates of that circle. Then I checked how many inliers around that circle and give a count according to number of inliers. After that I did the same thing 35 times and got the circle which have madximum inliers. Then I got the best sample by doing the same thing for inliers that I have calculated in the previous case.

Question 2

```
In [303...
          import cv2 as cv
          import numpy as np
          import matplotlib.pyplot as plt
          points = []
          def mousePoints(event,x,y,flags,params):# get mouse clicking coordinates
              if event == cv.EVENT_LBUTTONDOWN:
                  points.append([x,y])
          img1 = cv.imread(r"./images/001.jpg")
          assert img1 is not None
          img2 = cv.imread(r"./images/Logo_of_Sri_Lanka_Cricket.png")
          assert img2 is not None
          cv.imshow("Image",img1)
          cv.setMouseCallback("Image", mousePoints)
          cv.waitKey(0)
          cv.destroyAllWindows()
          des = np.array(points)
          src = np.array([[0,0],[316,0],[0,316],[316,316]]) #boundry coordinates of imag2
          h, status = cv.findHomography(src, des) # find homography matrix
          im_out = cv.warpPerspective(img2, h, (img1.shape[1],img1.shape[0]))
          im_out = cv.addWeighted(img1,1,im_out,0.5,0)
          im_out = cv.cvtColor(im_out,cv.COLOR_BGR2RGB)
          fig,ax=plt.subplots(1,1,figsize=(8,8))
          ax.imshow(im_out)
          ax.set_aspect('equal')
          ax.axis('off')
          plt.show()
```



Discussion

In this question (Question 2), One image have been superimposed into another image. It's done by computing the homography matrix using mouse clicking coordinates of one image and boundary coordinates of other image.

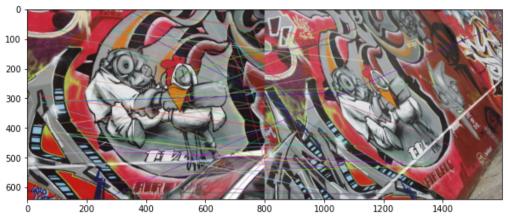
Question 3

```
img4 = cv.imread(r'./Images/img4.ppm')
assert img1 is not None

sift = cv.SIFT.create()
keyPoints1,Discriptor1 = sift.detectAndCompute(img1,None)
keyPoints2,Discriptor2 = sift.detectAndCompute(img4,None)

bf = cv.BFMatcher(cv.NORM_L1, crossCheck=True)
matches = bf.match(Discriptor1,Discriptor2)
matches = sorted(matches, key= lambda x:x.distance)

img3 = cv.drawMatches(img1,keyPoints1,img4,keyPoints2,matches[:50],img4,flags=2)
img3 = cv.cvtColor(img3,cv.CoLOR_BGR2RGB)
plt.figure(figsize=(10,8))
plt.imshow(img3)
plt.show()
```



```
In [326...
          img1=cv.imread(r'./Images/img1.ppm')
          img4=cv.imread(r'./Images/img4.ppm')
          img5=cv.imread(r'./Images/img5.ppm')
          assert img5 is not None
          gray1 = cv.cvtColor(img1, cv.COLOR_BGR2GRAY)
          gray4 = cv.cvtColor(img4, cv.COLOR_BGR2GRAY)
          gray5 = cv.cvtColor(img5, cv.COLOR_BGR2GRAY)
          sift = cv.SIFT_create()
          keypoint1, descriptor1 = sift.detectAndCompute(gray1,None) #take keypoints and discriptors
          keypoint4, descriptor4 = sift.detectAndCompute(gray4,None)
          keypoint5, descriptor5 = sift.detectAndCompute(gray5,None)
          bf = cv.BFMatcher()
          matches1to4 = bf.knnMatch(descriptor1,descriptor4,k=2)
          matches4to5 = bf.knnMatch(descriptor4,descriptor5,k=2)
          goodMatch1to4 = [] # take best matching points
          for m,n in matches1to4:
              if m.distance < 0.75*n.distance:</pre>
                  goodMatch1to4.append([m])
          goodMatch4to5 = []
          for m,n in matches4to5:
              if m.distance < 0.75*n.distance:</pre>
                  goodMatch4to5.append([m])
          dst_pts1to4 = np.float32([keypoint1[m[0].queryIdx].pt for m in goodMatch1to4]).reshape(-1, 2)
          src_pts1to4 = np.float32([keypoint4[m[0].trainIdx].pt for m in goodMatch1to4]).reshape(-1, 2)
          dst_pts4to5 = np.float32([keypoint4[m[0].queryIdx].pt for m in goodMatch4to5]).reshape(-1, 2)
          src_pts4to5 = np.float32([keypoint5[m[0].trainIdx].pt for m in goodMatch4to5]).reshape(-1, 2)
          def randomPoints(src,dst):
              randomPoints_L = [] # take 4 random points
              for i in range(4):
                  randomPoints_L.append(random.randint(0,len(dst)-1))
              src_p=np.array([src[i] for i in randomPoints_L]).astype(np.float32)
              dst_p = np.array([dst[i] for i in randomPoints_L]).astype(np.float32)
              return src_p,dst_p
          def homography(src_p,dst_P,n):
              # Compute homography by caluculating A matrix and eigenvectore of A.T @ A
              A=[]
              for i in range(n):
                  x, y = src_p[i][0], src_p[i][1]
                  xp, yp = dst_P[i][0], dst_P[i][1]
                  A.append([x, y, 1, 0, 0, 0, -x * xp, -xp * y, -xp])
                  A.append([0, 0, 0, x, y, 1, -yp * x, -yp * y, -yp])
              A=np.asarray(A)
              #print(A)
              w,v = np.linalg.eig(A.T @ A)
              index,=np.where(w==min(w))
              Homography = v.T[int(index)]
              Homography = Homography[-1]
              return Homography.reshape(3,3)
          def ransacHomography(src_Pts, dst_Pts):
              maxI = 0
              maxLSrc = []
              maxLDest = []
              for i in range(70): # execute Ransac alogorithm to get best homography matrix
                  srcP, destP = randomPoints(src_Pts, dst_Pts)
                  H = homography(srcP, destP, 4)
                  #print(H)
                  inlines = 0
                  linesSrc = []
                  lineDest = []
                  for p1, p2 in zip(src_Pts, dst_Pts):
                      p1U = (np.append(p1, 1)).reshape(3, 1)
                      p2e = H.dot(p1U)
                      p2e = (p2e / p2e[2])[:2].reshape(1, 2)[0]
```

```
if cv.norm(p2 - p2e) < 50:</pre>
                          inlines += 1
                          linesSrc.append(p1)
                          lineDest.append(p2)
                  if inlines > maxI:
                      maxI = inlines
                      maxLSrc = linesSrc.copy()
                      maxLSrc = np.asarray(maxLSrc, dtype=np.float32)
                      maxLDest = lineDest.copy()
                      maxLDest = np.asarray(maxLDest, dtype=np.float32)
              H = homography(maxLSrc, maxLDest, maxI)
              return H
          H14 = ransacHomography(src_pts1to4, dst_pts1to4)
          H45 = ransacHomography(src_pts4to5,dst_pts4to5)
In [15]:
          H15 = np.matmul(H14,H45)
          print("Homography Matrix of Img1 to Img5 is:",H15)
          dst = cv.warpPerspective(img5,H15, (img1.shape[1] + img5.shape[0], img5.shape[0]+ img5.shape[0]))
          fig,ax = plt.subplots(1,3,figsize=(10,8))
          ax[0].imshow(cv.cvtColor(img1,cv.COLOR_BGR2RGB))
          ax[1].imshow(cv.cvtColor(img5,cv.COLOR_BGR2RGB))
```

Homography Matrix of Img1 to Img5 is: [[2.14941665e+00 -1.51450668e-01 -4.78253783e+02] [-3.08439578e-01 9.07375902e-01 8.30656247e+01]



for i in range(3): ax[i].axis("off")

ax[2].imshow(cv.cvtColor(dst,cv.COLOR_BGR2RGB))





```
In [16]:
           H_original = np.array([[6.2544644e-01, 5.7759174e-02, 2.2201217e+02],
              [2.2240536e-01, 1.1652147e+00, -2.5605611e+01], [4.9212545e-04, -3.6542424e-05, 1.0000000e+00]])
           dst = cv.warpPerspective(img5,np.linalg.inv(H_original), (img1.shape[1] + img5.shape[0]+ img5.shape[0]+ img5.shape[0]))
           fig,ax = plt.subplots(1,3,figsize=(10,8))
           ax[0].imshow(cv.cvtColor(img1,cv.COLOR_BGR2RGB))
           ax[1].imshow(cv.cvtColor(img5,cv.COLOR_BGR2RGB))
           ax[2].imshow(cv.cvtColor(dst,cv.COLOR_BGR2RGB))
           for i in range(3):
               ax[i].axis("off")
```







```
In [337...
          def ssd(A,B):
            dif = A.ravel().astype(int) - B.ravel().astype(int)
            return np.dot( dif, dif )/len(dif)
          print(ssd(H15,H_original))
```

55857.11111111111

Discussion

Since there is a kind of high transformation between img1 and img5, homography matrix can not be identified easily using sift. Therefore what I have done is that calculated the homography matrixes H14 and H45 seperately and take the multiplication of those two and computed the homography matrix between img1 and img5. When I stiched those two images using calulated homography matrix and given homography matrix, there is not such a big different that human eye can catch. But when I calculate sum of square difference it gives a value around 50000.