```
# import the necessary packages
import numpy as np
import imutils
import cv2
import argparse
# stuff just for IPython
from IPython.display import display
from IPython.display import Image
from matplotlib import pyplot as plt
class Stitcher:
    def __init__(self):
        # determine if we are using OpenCV v3.X
        self.isv3 = imutils.is_cv3()
    def stitch(self, images, ratio=0.75, reprojThresh=4.0,
        showMatches=False):
        # unpack the images, then detect keypoints and extract
        # local invariant descriptors from them
        (imageB, imageA) = images
        (kpsA, featuresA) = self.detectAndDescribe(imageA)
        (kpsB, featuresB) = self.detectAndDescribe(imageB)
        # match features between the two images
        M = self.matchKeypoints(kpsA, kpsB,
            featuresA, featuresB, ratio, reprojThresh)
        # if the match is None, then there aren't enough matched
        # keypoints to create a panorama
        if M is None:
            return None
        # otherwise, apply a perspective warp to stitch the images
        # together
        (matches, H, status) = M
        result = cv2.warpPerspective(imageA, H,
            (imageA.shape[1] + imageB.shape[1], imageA.shape[0]))
        result[0:imageB.shape[0], 0:imageB.shape[1]] = imageB
        # check to see if the keypoint matches should be visualized
        if showMatches:
            vis = self.drawMatches(imageA, imageB, kpsA, kpsB, matches,
                status)
            # return a tuple of the stitched image and the
            # visualization
            return (result, vis)
```

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# return the stitched image
    return result
def detectAndDescribe(self, image):
    # convert the image to grayscale
    gray = cv2.cvtColor(image, cv2.COLOR_BGR2GRAY)
    # check to see if we are using OpenCV 3.X
    if self.isv3:
        # detect and extract features from the image
        descriptor = cv2.xfeatures2d.SIFT_create()
        (kps, features) = descriptor.detectAndCompute(image, None)
    # otherwise, we are using OpenCV 2.4.X
    else:
        # detect keypoints in the image
        detector = cv2.FeatureDetector_create("SIFT")
        kps = detector.detect(gray)
        # extract features from the image
        extractor = cv2.DescriptorExtractor_create("SIFT")
        (kps, features) = extractor.compute(gray, kps)
    # convert the keypoints from KeyPoint objects to NumPy
    # arrays
    kps = np.float32([kp.pt for kp in kps])
    # return a tuple of keypoints and features
    return (kps, features)
def matchKeypoints(self, kpsA, kpsB, featuresA, featuresB,
    ratio, reprojThresh):
    # compute the raw matches and initialize the list of actual
    # matches
    matcher = cv2.DescriptorMatcher_create("BruteForce")
    rawMatches = matcher.knnMatch(featuresA, featuresB, 2)
    matches = []
    # loop over the raw matches
    for m in rawMatches:
        # ensure the distance is within a certain ratio of each
        # other (i.e. Lowe's ratio test)
        if len(m) == 2 and m[0].distance < m[1].distance * ratio:</pre>
            matches.append((m[0].trainIdx, m[0].queryIdx))
    # computing a homography requires at least 4 matches
    if len(matches) > 4:
        # construct the two sets of points
        ptsA = np.float32([kpsA[i] for (_, i) in matches])
        ptsB = np.float32([kpsB[i] for (i, _) in matches])
```

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# compute the homography between the two sets of points
        (H, status) = cv2.findHomography(ptsA, ptsB, cv2.RANSAC,
            reprojThresh)
        # return the matches along with the homograpy matrix
        # and status of each matched point
        return (matches, H, status)
    # otherwise, no homograpy could be computed
    return None
def drawMatches(self, imageA, imageB, kpsA, kpsB, matches, status):
    # initialize the output visualization image
    (hA, wA) = imageA.shape[:2]
    (hB, wB) = imageB.shape[:2]
    vis = np.zeros((max(hA, hB), wA + wB, 3), dtype="uint8")
    vis[0:hA, 0:wA] = imageA
    vis[0:hB, wA:] = imageB
    # loop over the matches
    for ((trainIdx, queryIdx), s) in zip(matches, status):
        # only process the match if the keypoint was successfully
        # matched
        if s == 1:
            # draw the match
            ptA = (int(kpsA[queryIdx][0]), int(kpsA[queryIdx][1]))
            ptB = (int(kpsB[trainIdx][0]) + wA, int(kpsB[trainIdx][1]
            cv2.line(vis, ptA, ptB, (0, 255, 0), 1)
    # return the visualization
    return vis
```

```
imageA = cv2.imread('pano1_0008.jpg')
imageB = cv2.imread('pano1_0009.jpg')
imageC = cv2.imread('pano1_0010.jpg')
imageD = cv2.imread('pano1_0011.jpg')

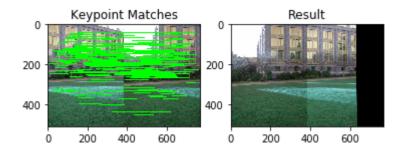
plt.subplot(1,4,1)
plt.imshow(imageA)
plt.subplot(1,4,2)
plt.imshow(imageB)
plt.subplot(1,4,3)
plt.imshow(imageC)
plt.subplot(1,4,4)
plt.imshow(imageD)
plt.subplot(1,4,4)
plt.imshow(imageD)
plt.show()
```

```
0
200
400
0
200
0
200
0
200
0
200
0
200
0
200
0
200
```

```
# test sequence 2: run stitcher on two images #

stitcher = Stitcher()
  (result,vis) = stitcher.stitch([imageB,imageA],showMatches = True)

plt.subplot(1,2,1)
  plt.imshow(vis)
  plt.title("Keypoint Matches")
  plt.subplot(1,2,2)
  plt.imshow(result)
  plt.title("Result")
  plt.show()
```



```
# note that the order does appear to matter.
# trying to reverse the order of the inputs into the stitcher
# gets you something like this

(result,vis) = stitcher.stitch([imageA,imageB],showMatches = True)

plt.subplot(1,2,1)
plt.imshow(vis)
plt.title("Keypoint Matches")
plt.subplot(1,2,2)
plt.imshow(result)
plt.title("Result")
plt.show()
# Note that the result obtained is not a stitched image.

# this is just to put things back as they were after the demonstration (result,vis) = stitcher.stitch([imageB,imageA],showMatches = True)
```

```
200 - 200 400 600 0 200 400 600
```

```
# now we need to start stitching multiple images together
current_pano = result
(result, vis) = stitcher.stitch([imageC,current_pano],showMatches = True)
plt.subplot(1,2,1)
plt.imshow(vis)
plt.title("Keypoint Matches")
plt.subplot(1,2,2)
plt.imshow(result)
plt.title("Result")
plt.show()
current_pano = result
(result, vis) = stitcher.stitch([imageD,current_pano],showMatches = True)
plt.subplot(1,2,1)
plt.imshow(vis)
plt.title("Keypoint Matches")
plt.subplot(1,2,2)
plt.imshow(result)
plt.title("Result")
plt.show()
```

