

# HW5: Feature Detection and Matching

Assigned: Tuesday, November 4

Due: Tuesday, November 18



img1



img3



img5

# Your task

- Write Harris detector **ComputeHarris()** in features.cpp
- Write Feature descriptor **ExtractDescriptor()** in features.cpp
- Run your program to get required numerical and image results
- Compare results from your features and SIFT features

# Interest Point Detection

1. Convert the RGB image to a gray-scale image. (Save the RGB image for later.)
2. Apply a 9 x 9 Gaussian filter we give you.
3. Construct the Harris matrix  $M$  using a 5 x 5 neighborhood around each pixel.
4. Compute corner response  $R = \det(M) - k * \text{Tr}(M)^2$  at each pixel.
5. If  $R$  is above a threshold and is a local maximum in a 3 x 3 neighborhood, select it as an interest point.
6. 600 to 3000 points are expected to be detected for each image

# Feature Description

1. Go back to RGB space.
2. Take a 45 x 45 window around each feature point.
3. Divide that window into 9 x 9 squares, each of them size 5 x 5.
4. Applying a (given) 5 x 5 mask to each of these squares in each of R, G, and B, gives 3 results per square x 81 squares = a vector  $V$  of 243 values.
5. Compute  $V' = V / \|V\|_2$  ( $V$  divided by its L2-norm).
6.  $V'$  is the descriptor.



# Evaluation

- Working implementation of all the required parts: 11 points
  - Harris operator: 4 points
  - Feature descriptor: 5 points
  - Feature matching: 2 points
- Quality of code including code structure, comments and documentation: 4 points
- Completion and quality of the report: 5 points
- Quality of results: 5 points
  - Harris operator: 2 points
  - Simple descriptor: 3 points

# Evaluation

- Extra credit:
  - Advanced way of match finding: 3 points
  - Advanced descriptor: Rotation invariant descriptor only: 7 points
  - Advanced descriptor: Rotation and scale invariant descriptor: 10 points

# Data sets

- Required: *bikes* and *leuven*



- Extra credit: *graf* and *wall*



# Data sets

- SIFT features: img1.key

```
1 3154 128
2 303.31 746.38 91.99 0.942
3 111 61 2 2 83 79 1 13 124 124 61 7 1 3 2 8 2 26 75 35
4 11 5 1 0 0 0 0 0 0 0 0 61 36 0 0 124 124 8 11
5 124 81 22 13 22 54 33 59 7 4 24 69 124 108 17 10 0 0 0 9
6 49 1 0 0 11 0 0 0 35 93 18 8 101 57 106 58 47 51 20 25
7 4 10 83 124 124 15 1 1 0 0 0 8 32 0 0 0 0 0 0 0
8 5 3 0 0 0 0 9 10 30 19 0 0 0 0 8 8 2 0 0 0
9 0 0 0 0 0 0 0
10 303.31 746.38 91.99 -2.145
11 0 0 0 0 0 0 0 0 3 0 0 0 0 0 0 17 16 36 18 0 0
12 0 1 17 13 6 3 0 0 0 0 0 0 50 0 0 0 0 0 0 18
13 125 24 3 4 10 15 90 125 43 56 21 37 118 57 90 41 42 86 13 7
14 7 0 0 0 46 2 0 0 0 0 0 14 125 95 18 14 13 8 40 63
15 20 45 26 60 125 80 17 6 125 125 5 10 44 23 0 0 0 0 0 0
16 0 0 0 1 4 1 0 0 11 52 82 23 0 1 0 14 125 125 34 2
17 125 90 1 13 77 39 2 4
```

Number of interest points

Length of feature vector

First point  
<x y rotation scale>

Feature vector  
(descriptor)  
with length 128

Second point  
<x y rotation scale>

Feature vector  
(descriptor)  
with length 128

# Data sets

- Image database:  
img.kdb (SIFT)      imgsimple.kdb (Your Harris)

```
1 img1.ppm img1.key
2 img2.ppm img2.key
3 img3.ppm img3.key
4 img4.ppm img4.key
5 img5.ppm img5.key
6 img6.ppm img6.key
```

```
1 img1.ppm feature1.f
2 img2.ppm feature2.f
3 img3.ppm feature3.f
4 img4.ppm feature4.f
5 img5.ppm feature5.f
6 img6.ppm feature6.f
```

- Homography files: H1to2p  
(transformation matrix from image 1 to image 2)

```
1 1.0107879e+00 8.2814684e-03 1.8576800e+01
2 -4.9128885e-03 1.0148779e+00 -2.8851517e+01
3 -1.9166087e-06 8.1537620e-06 1.0000000e+00
```

# Software

- Command line

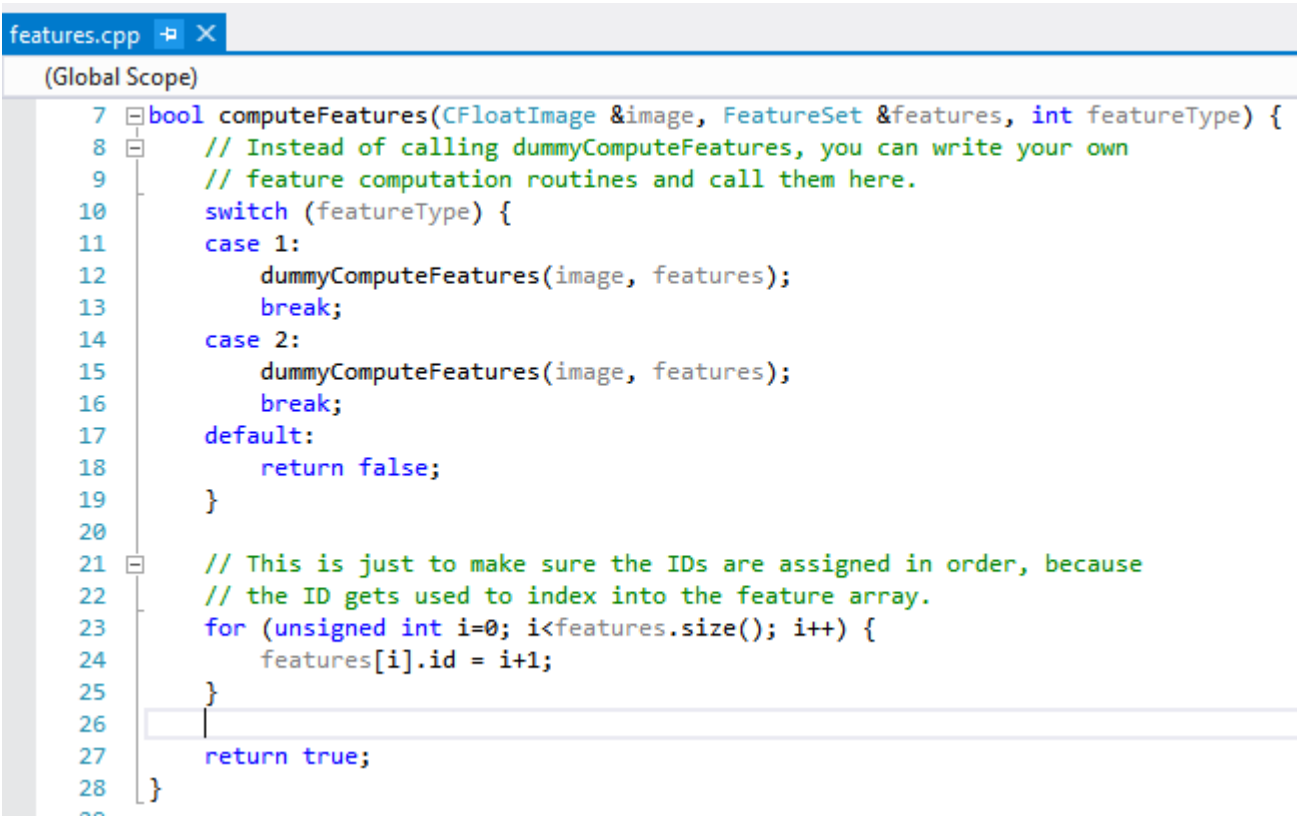
- `./CSE455 computeFeatures`  
`../bikes/img1.ppm ../bikes/feature1.f`
- `./CSE455 testMatch`  
`../bikes/feature1.f ../bikes/feature2.f`  
`../bikes/H1to2p`
- `./CSE455 testSIFTMatch`  
`../bikes/img1.key ../bikes/img2.key`  
`../bikes/H1to2p`
- `./CSE455 benchmark ../bikes`

useful for  
debugging

- Graphical User Interface (GUI): visualization

# Computing features

```
./CSE455 computeFeatures ../bikes/img1.ppm ../bikes/feature1.f
```



```
features.cpp [X]
(Global Scope)
7 bool computeFeatures(CFloatImage &image, FeatureSet &features, int featureType) {
8     // Instead of calling dummyComputeFeatures, you can write your own
9     // feature computation routines and call them here.
10    switch (featureType) {
11    case 1:
12        dummyComputeFeatures(image, features);
13        break;
14    case 2:
15        dummyComputeFeatures(image, features);
16        break;
17    default:
18        return false;
19    }
20
21    // This is just to make sure the IDs are assigned in order, because
22    // the ID gets used to index into the feature array.
23    for (unsigned int i=0; i<features.size(); i++) {
24        features[i].id = i+1;
25    }
26
27    return true;
28 }
29
```

# Computing features

- It executes your code!

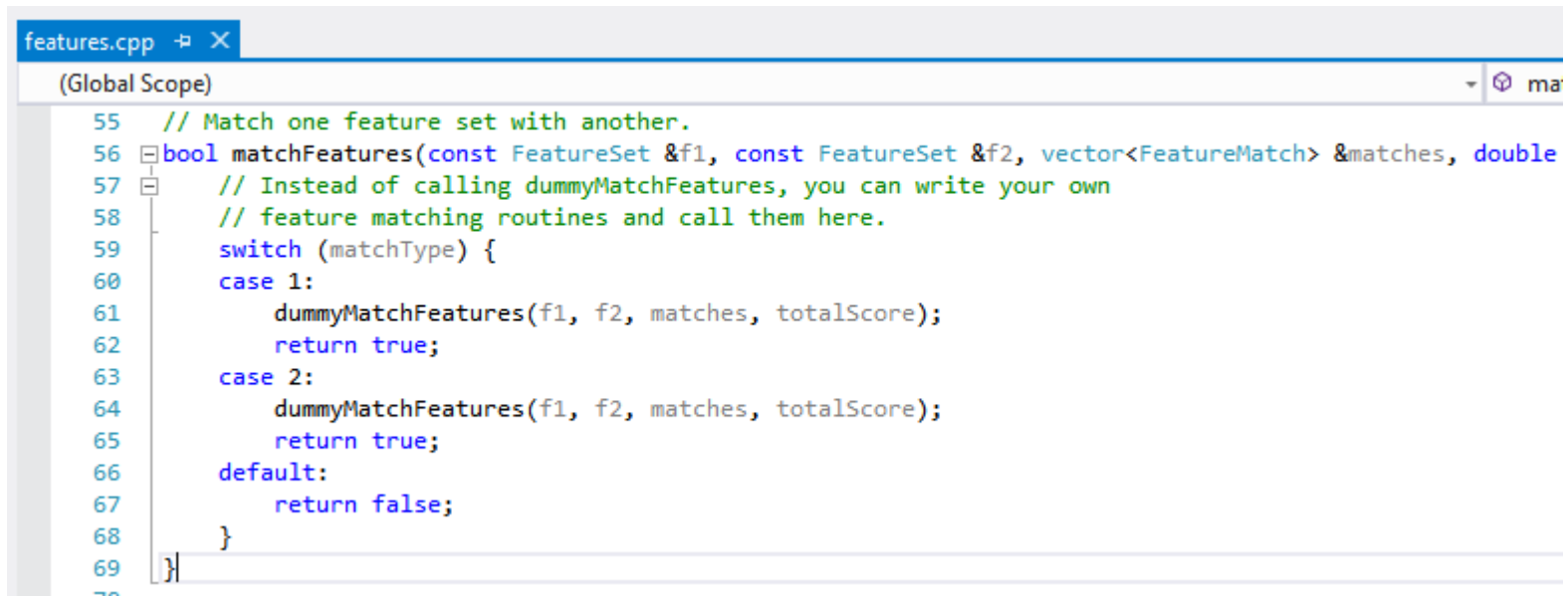
```
features.cpp* [X]
(Global Scope)
111
112 void dummyComputeFeatures(CFloatImage &image, FeatureSet &features)
113 {
114     // Compute the interest function
115
116     CShape shape0 = image.Shape();
117     CShape shape = shape0;
118     shape.nBands = 1;
119
120     CFloatImage harris(shape);
121
122     // TODO: write your interest point detector in ComputeHarris()
123     ComputeHarris(image, harris);
```

```
149
150     if (isMax){
151         // TODO: Write your feature descriptor in ExtractDescriptor()
152         ExtractDescriptor(x, y, blurImage, features);
    } // end if isMax
```



# Matching features

```
./CSE455 testMatch ../bikes/feature1.f ../bikes/feature2.f  
../bikes/H1to2p
```




```
features.cpp [X]  
(Global Scope) ma  
55 // Match one feature set with another.  
56 bool matchFeatures(const FeatureSet &f1, const FeatureSet &f2, vector<FeatureMatch> &matches, double  
57 // Instead of calling dummyMatchFeatures, you can write your own  
58 // feature matching routines and call them here.  
59 switch (matchType) {  
60 case 1:  
61     dummyMatchFeatures(f1, f2, matches, totalScore);  
62     return true;  
63 case 2:  
64     dummyMatchFeatures(f1, f2, matches, totalScore);  
65     return true;  
66 default:  
67     return false;  
68 }  
69 }
```

# Matching features

```
features.cpp  ↗ ✕
(Global Scope)  dummyM
163 void dummyMatchFeatures(const FeatureSet &f1, const FeatureSet &f2, vector<FeatureMatch> &matches, double
164     int m = f1.size();
165     int n = f2.size();
166
167     matches.resize(m);
168     totalScore = 0;
169
170     double d;
171     double dBest;
172     int idBest;
173
174     for (int i=0; i<m; i++) {
175         dBest = 1e100;
176         idBest = 0;
177
178         for (int j=0; j<n; j++) {
179             d = distanceEuclidean(f1[i].data, f2[j].data);
180
181             if (d < dBest) {
182                 dBest = d;
183                 idBest = f2[j].id;
184             }
185         }
186
187         matches[i].id = idBest;
188         matches[i].score = exp(-dBest);
189         totalScore += matches[i].score;
```

# Matching SIFT features

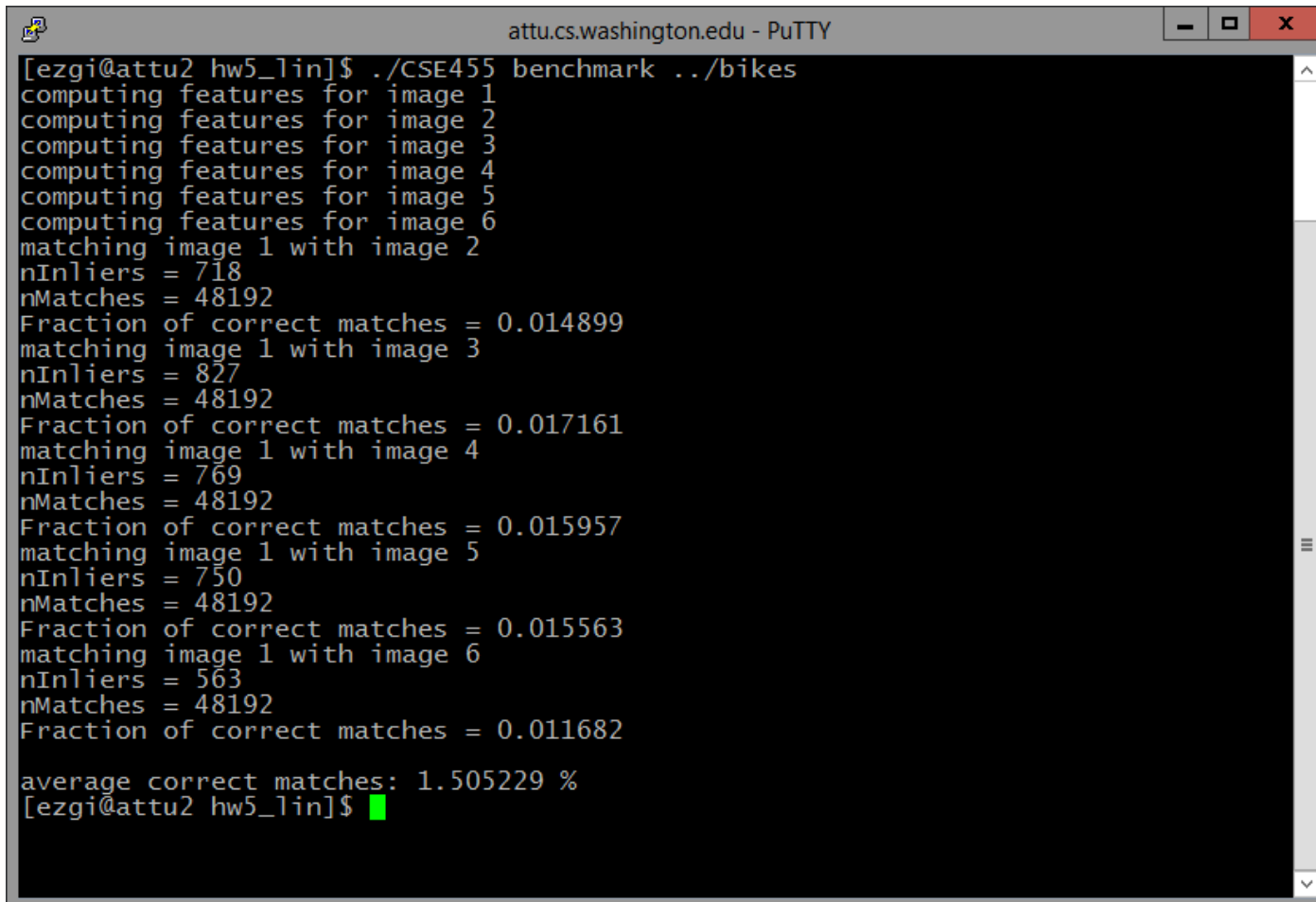
```
./CSE455 testSIFTMatch ../bikes/img1.key ../bikes/img2.key  
../bikes/H1to2p
```



```
attu.cs.washington.edu - PuTTY  
[ezgi@attu2 hw5_lin]$ ./CSE455 testSIFTMatch ../bikes/img1.key ../bikes/img2.key  
../bikes/H1to2p  
nInliers = 1927  
nMatches = 3154  
Fraction of correct matches = 0.610970  
0.610970  
[ezgi@attu2 hw5_lin]$ █
```

# Benchmark

```
./CSE455 benchmark ../bikes
```



```
attu.cs.washington.edu - PuTTY
[ezgi@attu2 hw5_lin]$ ./CSE455 benchmark ../bikes
computing features for image 1
computing features for image 2
computing features for image 3
computing features for image 4
computing features for image 5
computing features for image 6
matching image 1 with image 2
nInliers = 718
nMatches = 48192
Fraction of correct matches = 0.014899
matching image 1 with image 3
nInliers = 827
nMatches = 48192
Fraction of correct matches = 0.017161
matching image 1 with image 4
nInliers = 769
nMatches = 48192
Fraction of correct matches = 0.015957
matching image 1 with image 5
nInliers = 750
nMatches = 48192
Fraction of correct matches = 0.015563
matching image 1 with image 6
nInliers = 563
nMatches = 48192
Fraction of correct matches = 0.011682

average correct matches: 1.505229 %
[ezgi@attu2 hw5_lin]$
```

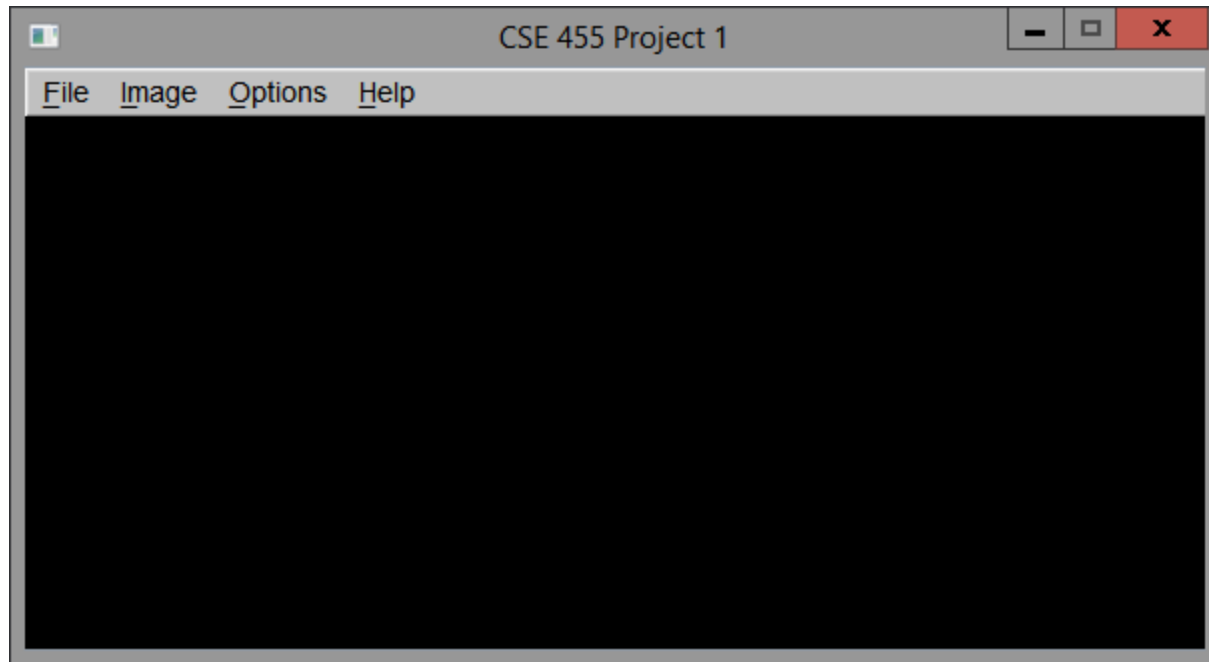
# Benchmark

```
./CSE455 benchmark ../bikes
```

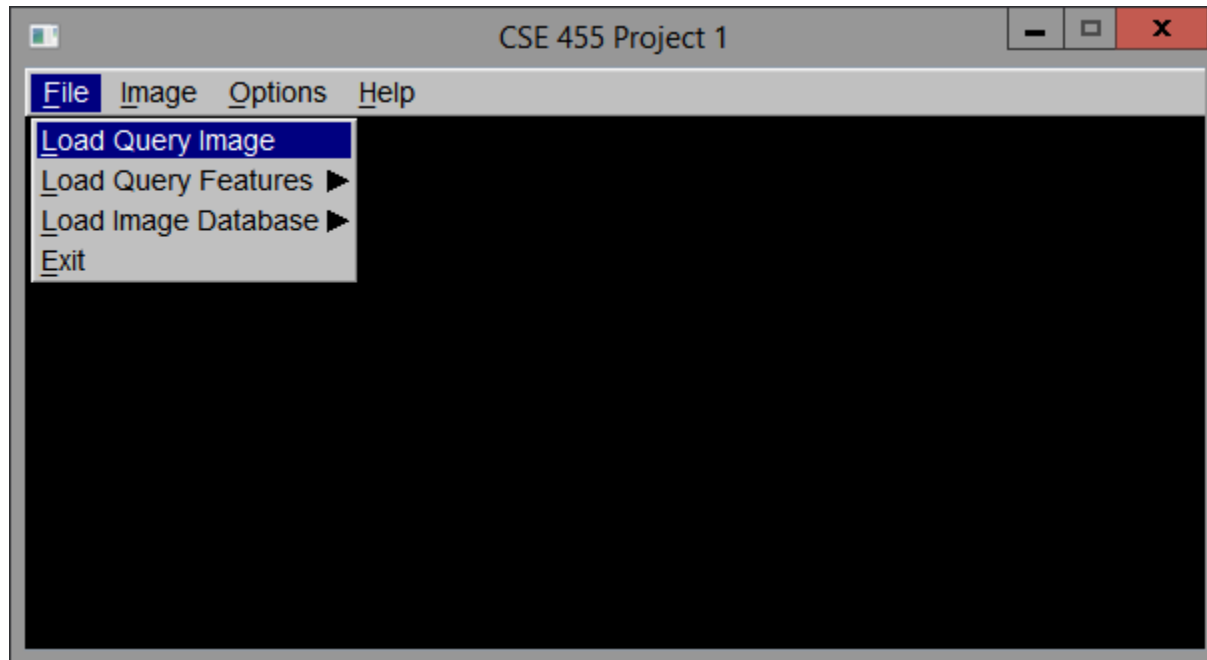
It computes Harris features and match them using SSD for all the images in the given directory.

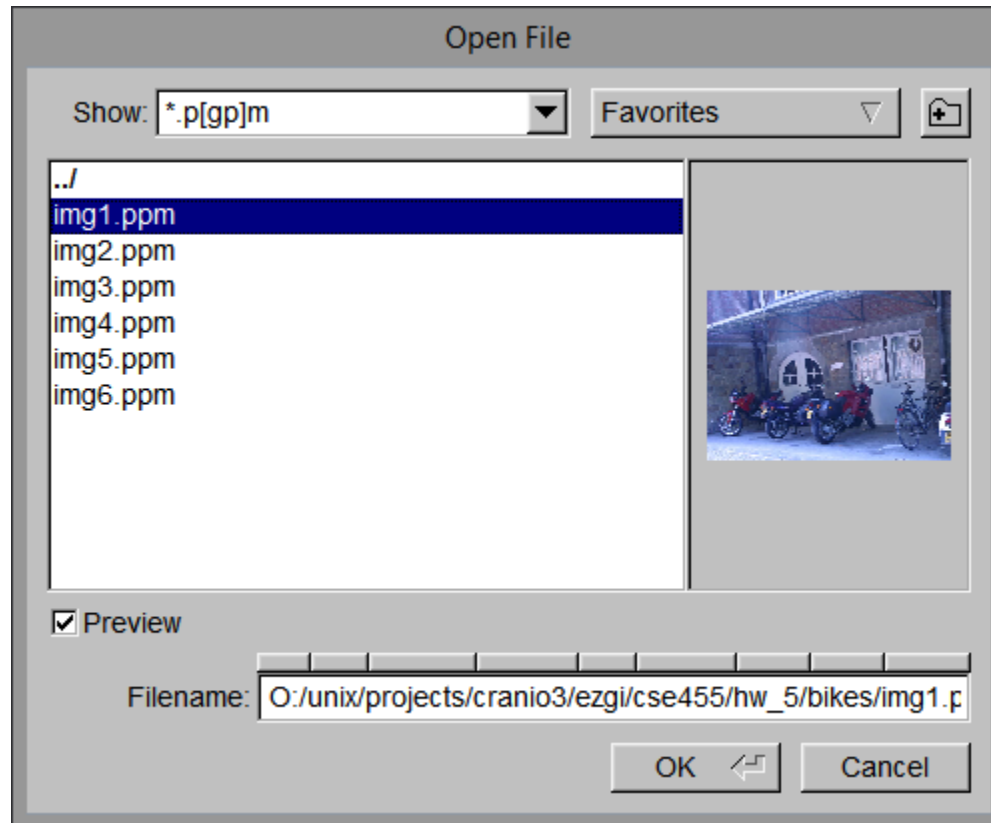
It reports the average match score.

# GUI - DEMO



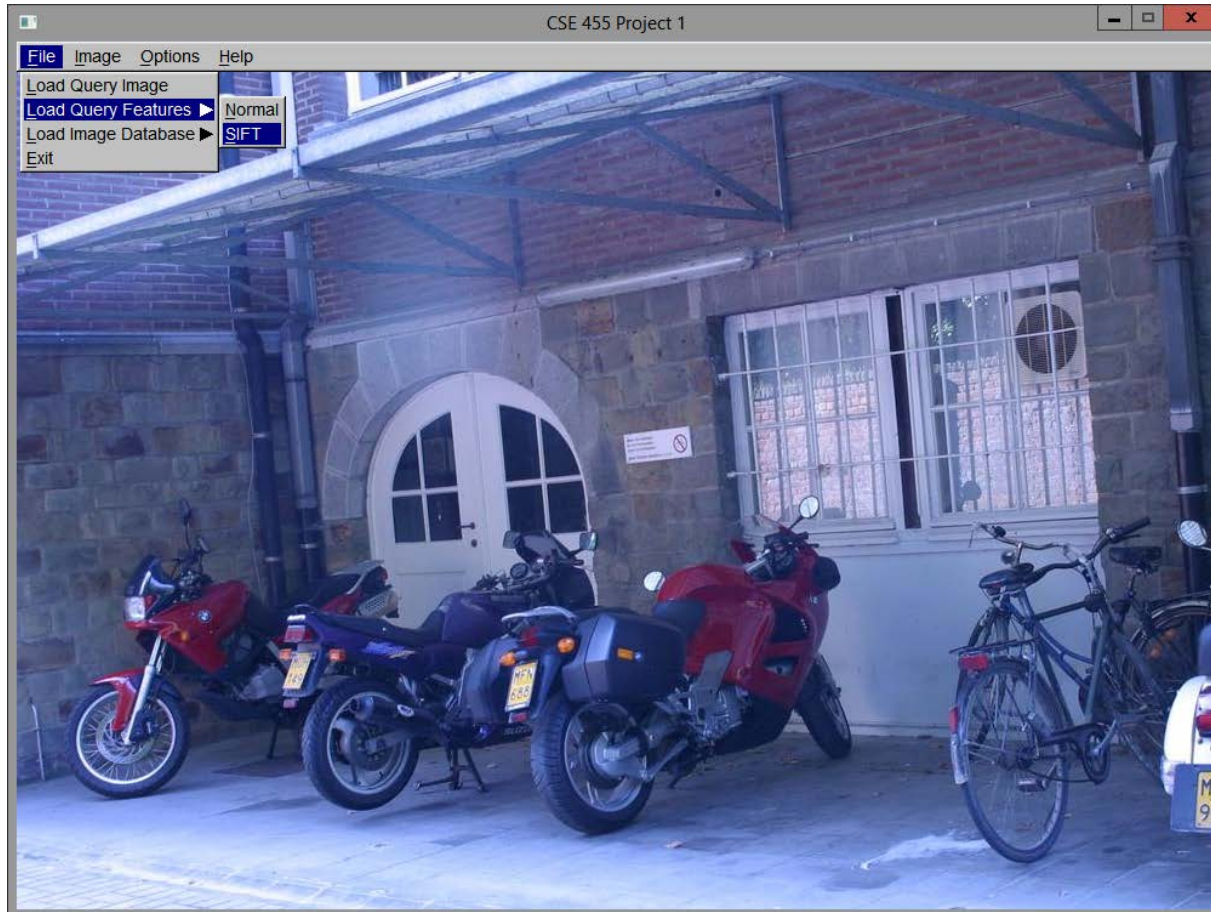
First load the query image  
This is the image you will compare with the others.







Then load the features for the query image.  
Normal = Your implementation, SIFT is provided.



### Open File

Show: \*.key

Favorites

|          |                       |
|----------|-----------------------|
| ../      | 3154 128^M            |
| img1.key | 303.31 746.38 91.99 C |
| img2.key | 111 61 2 2 83 79 1 1  |
| img3.key | 11 5 1 0 0 0 0 0 C    |
| img4.key | 124 81 22 13 22 54 3  |
| img5.key | 49 1 0 0 11 0 0 0 3E  |
| img6.key | 4 10 83 124 124 15 1  |
|          | 5 3 0 0 0 0 9 10 30   |
|          | 0 0 0 0 0 0 0 0^M     |
|          | 303.31 746.38 91.99 - |
|          | 0 0 0 0 0 0 0 0 3 0   |
|          | 0 1 17 13 6 3 0 0 0   |
|          | 125 24 3 4 10 15 90   |
|          | 7 0 0 0 46 2 0 0 0 C  |
|          | 20 45 26 60 125 80 1  |
|          | 0 0 0 1 4 1 0 0 11 E  |
|          | 125 90 1 13 77 39 2   |

Preview

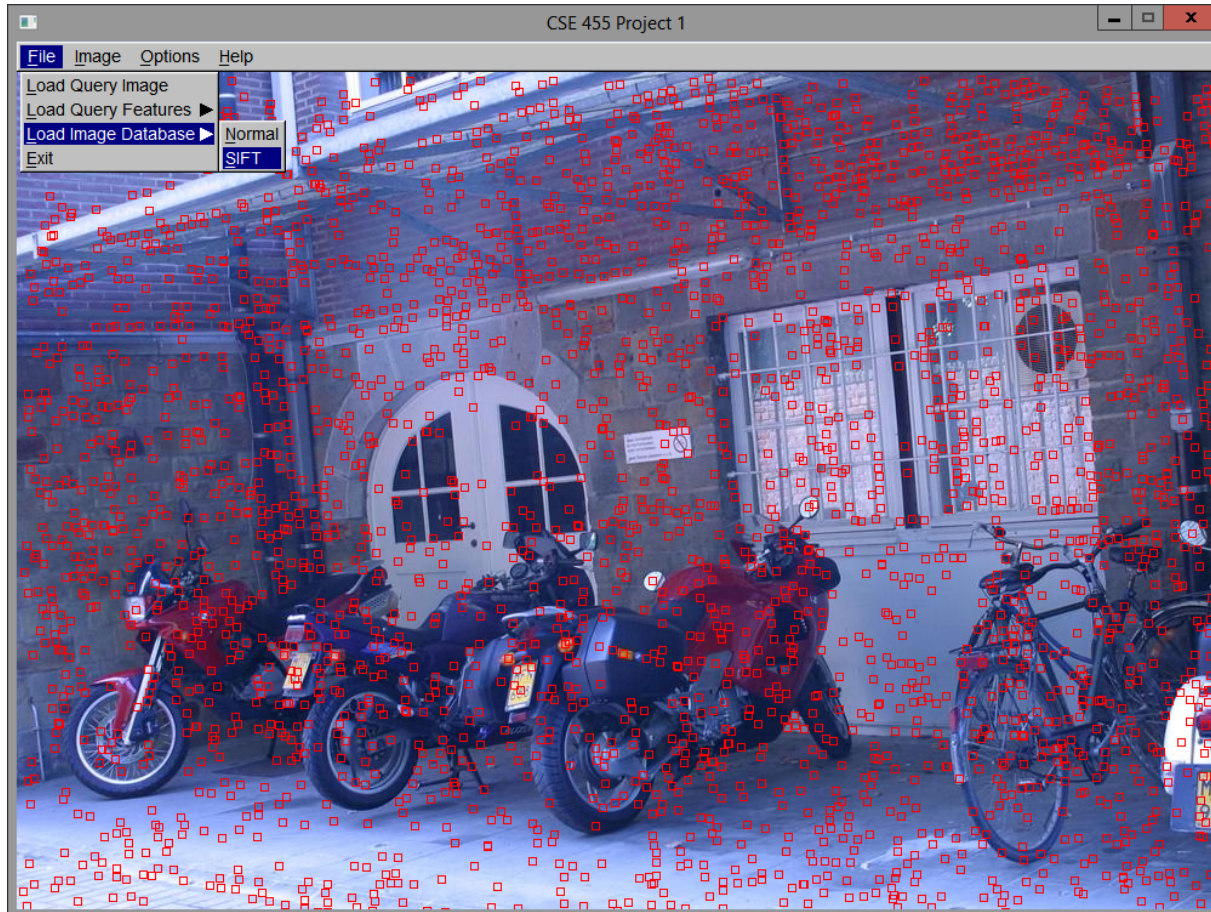
Filename: O:/unix/projects/cranio3/ezgi/cse455/hw\_5/bikes/img1.

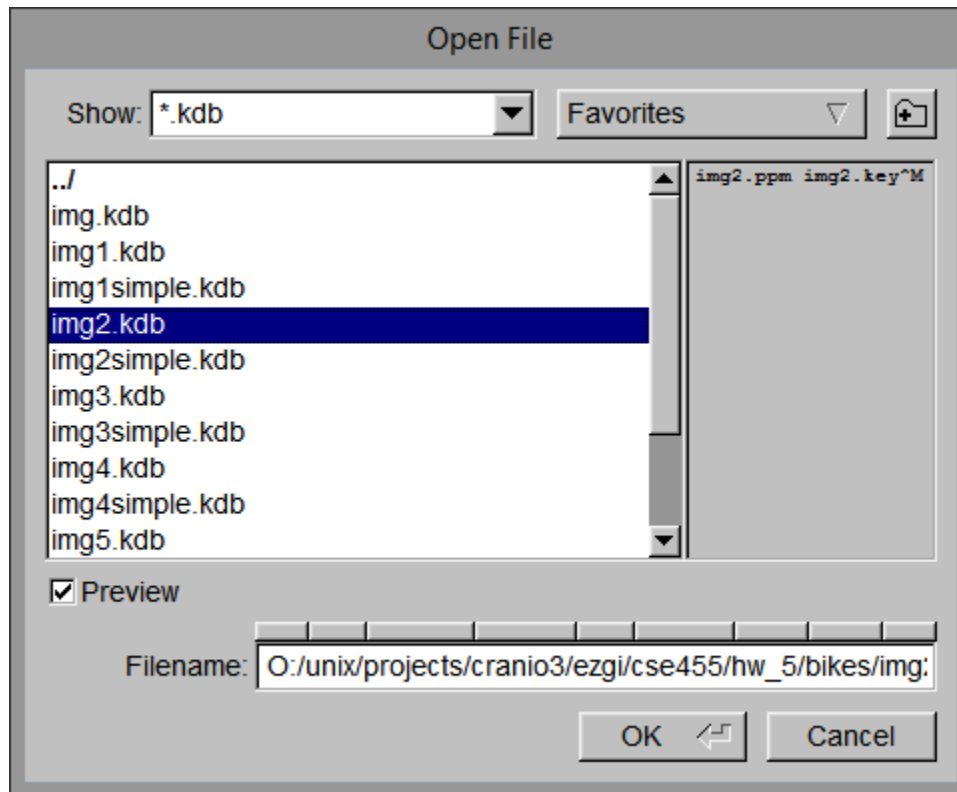
OK



Cancel

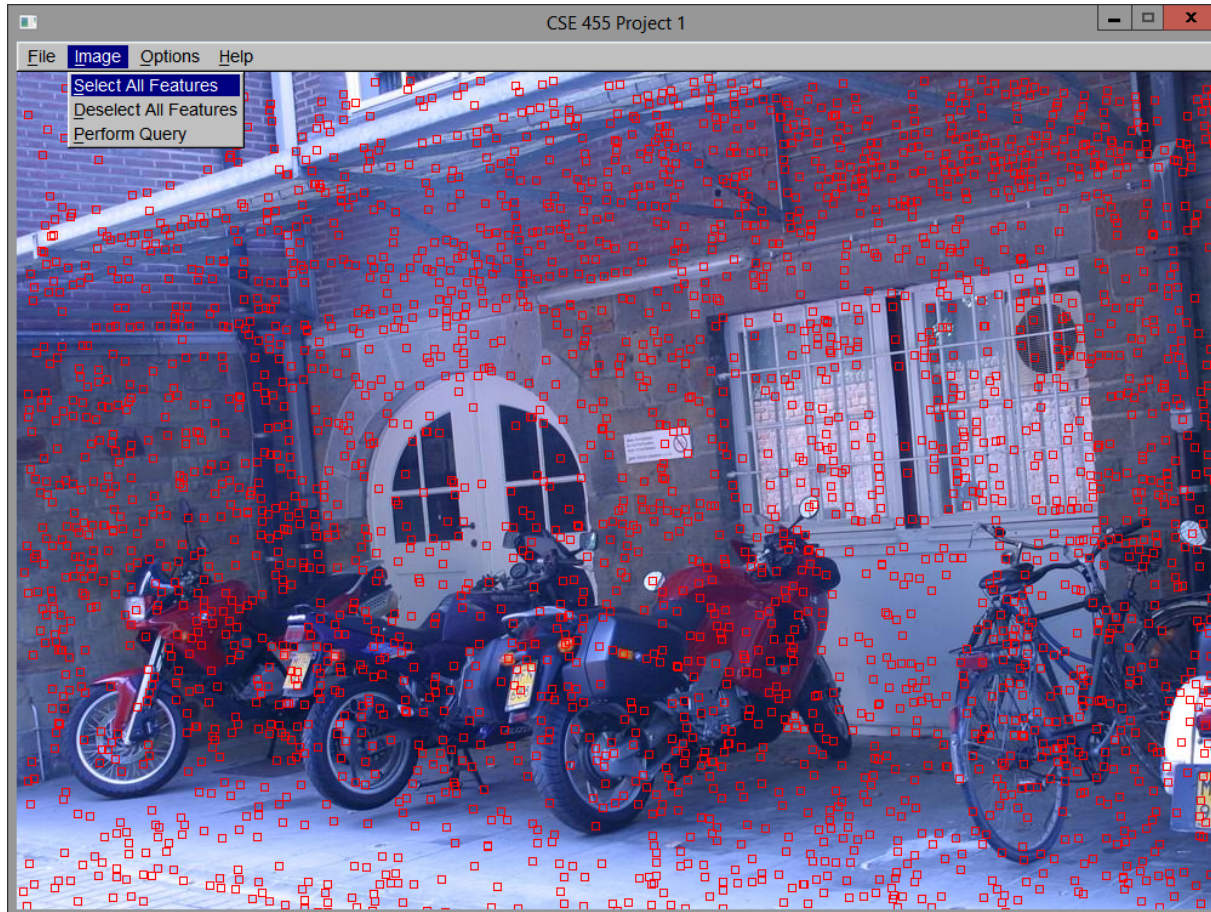
Then load the image database.  
This is the other image you will compare with the query.  
It's actually a list of filenames.



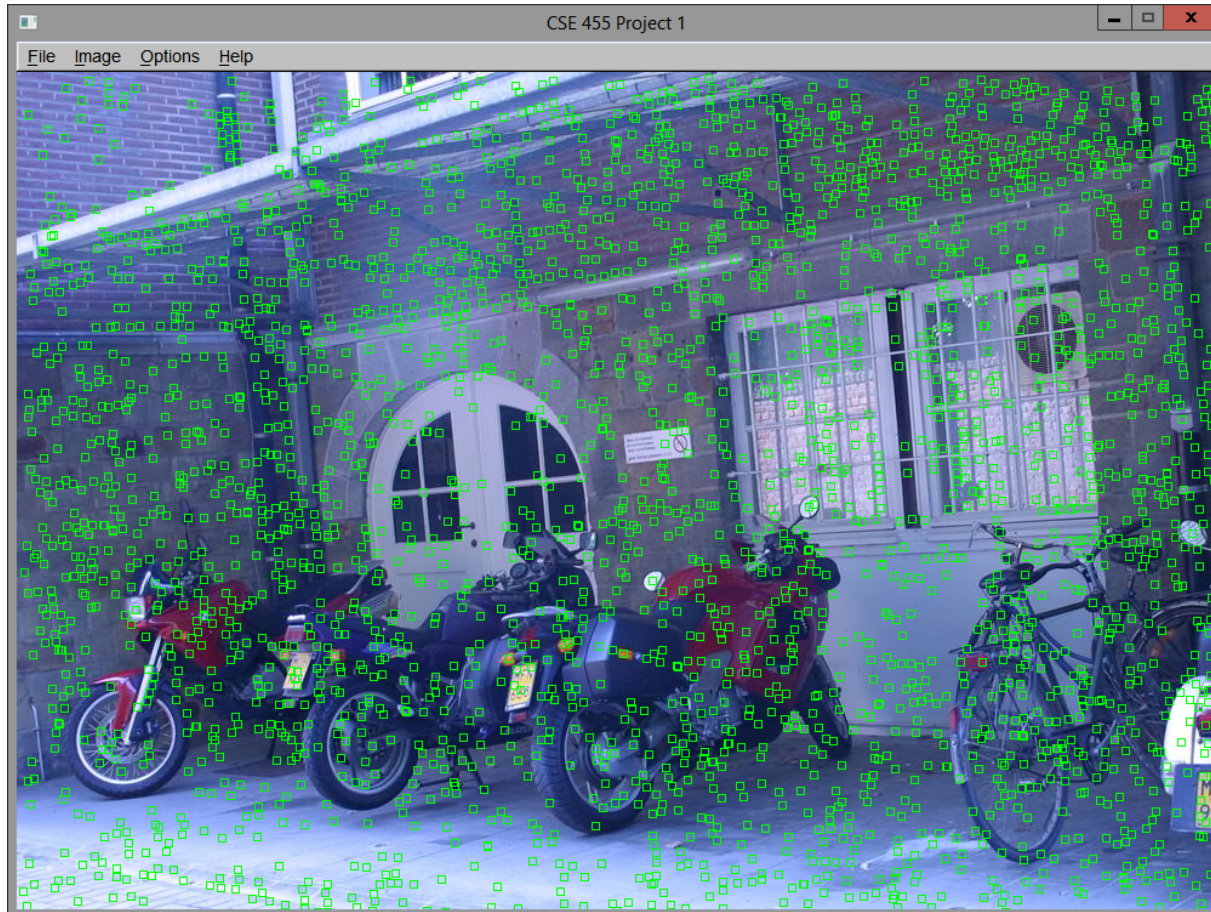




Then select which interest points will be used in matching. You can select all points.



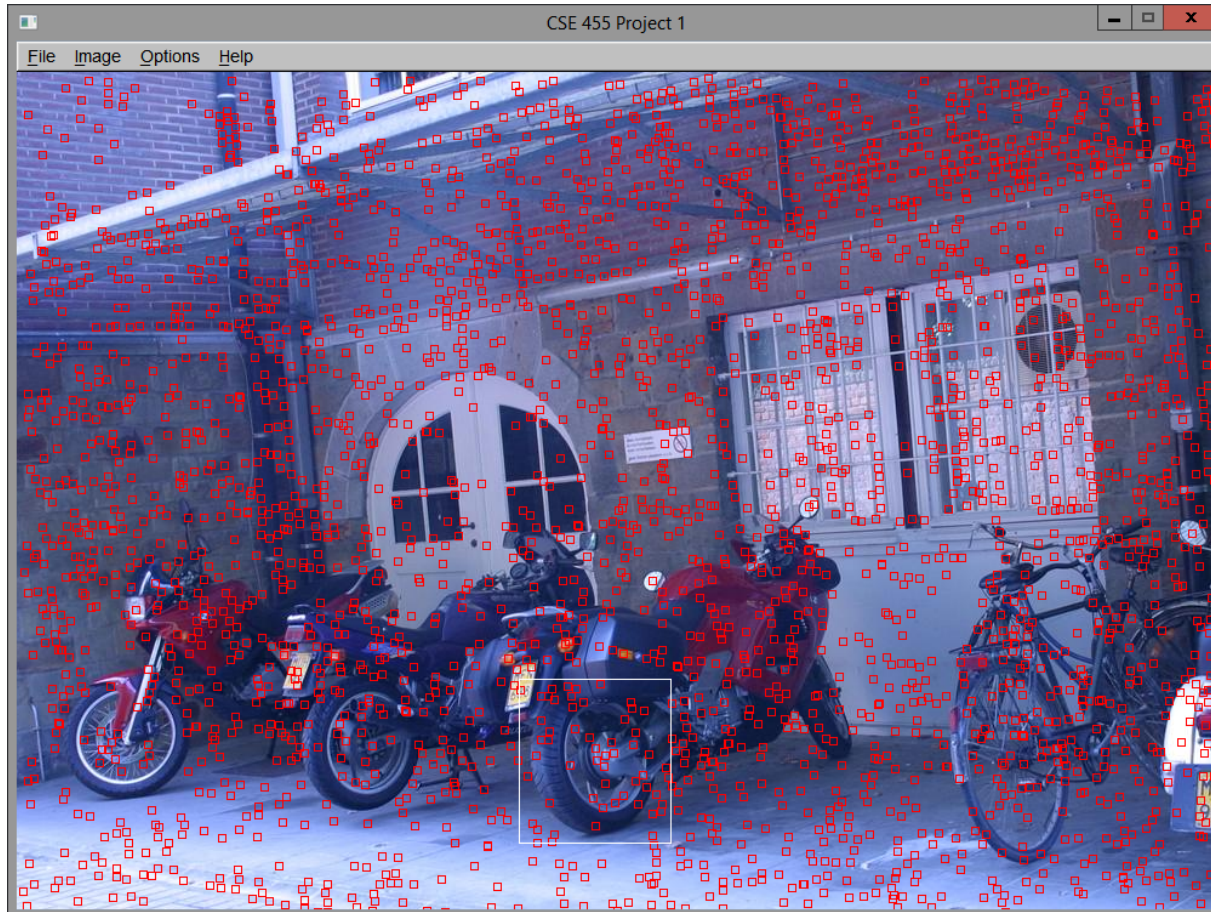
Selected points are colored green.



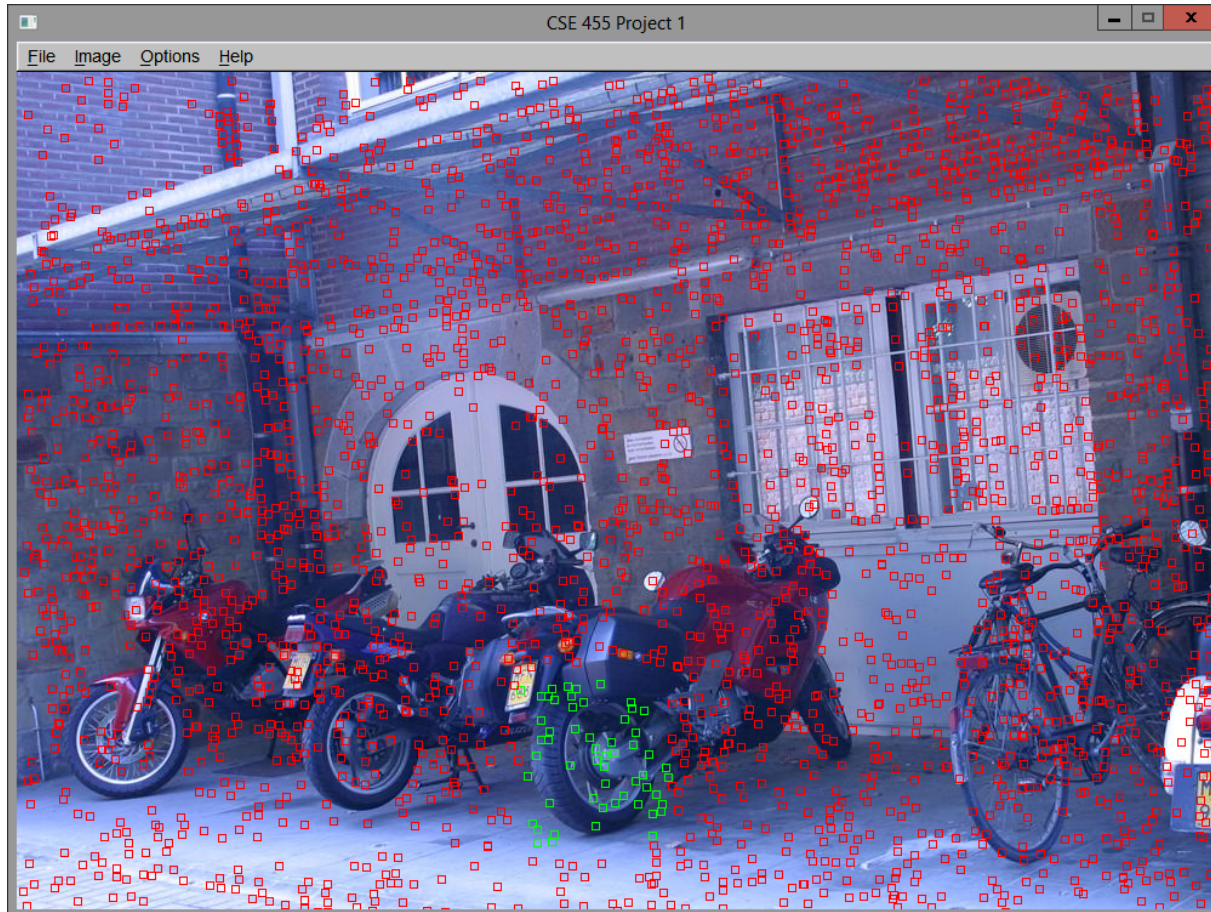


OR

You can select a bunch of points by using the mouse pointer, right clicking and dragging.

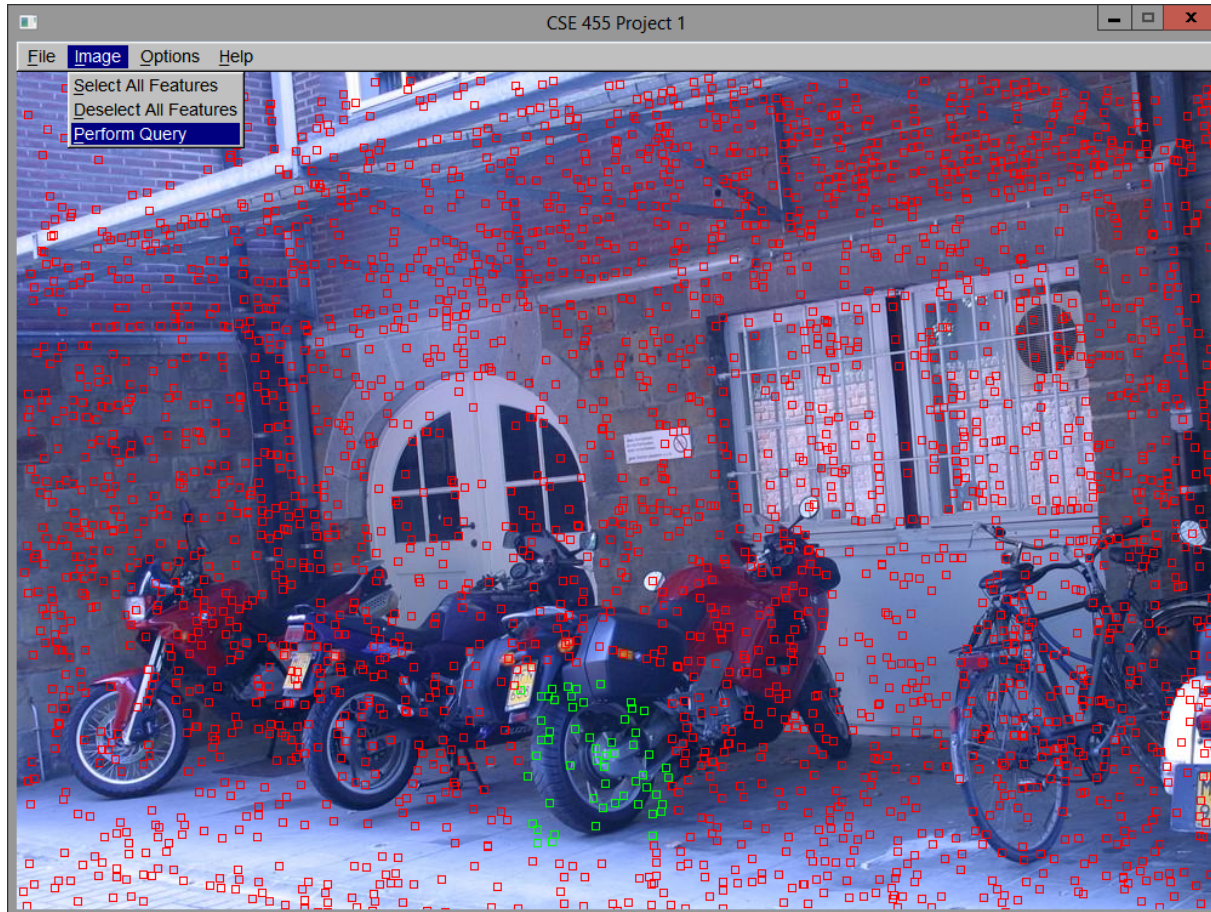


Selected points are colored green.





Finally, perform the query. This may take a while.



Matches are returned.

