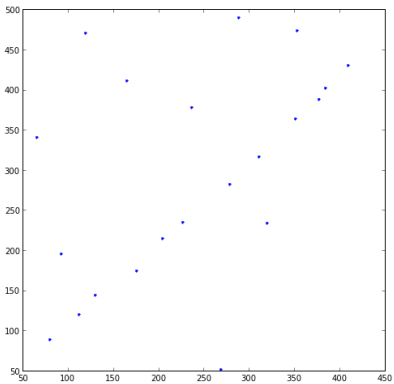


Sample Data for Line Finding

```
1 image = transpose(imread("points.png")[:,::-1, :, 0])
2 labels, n = measurements.label(image)
3 points = array(measurements.center_of_mass(image, labels, range(1, n))
  )
```

```
1 plot(points[:,0], points[:,1], 'r.')
```



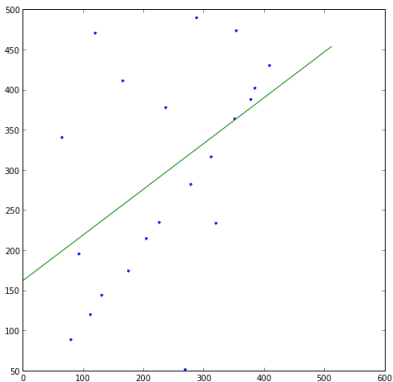
Robust Least Squares

Problem:

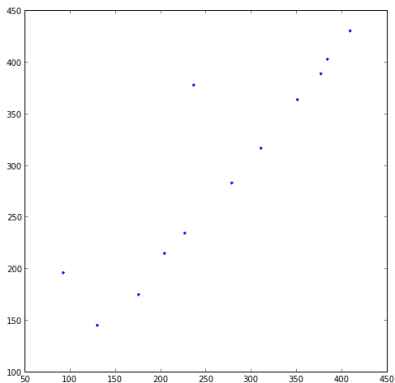
Why don't we just perform a global least square fit?

- ▶ images contain a large amount of clutter (points not belonging to the target object)
- ▶ if we add points that aren't part of the target line to the least square match, it will break the match

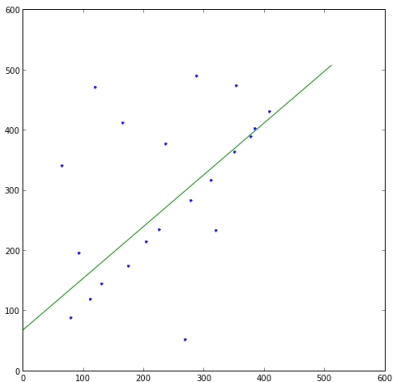
```
1 m,b = polyfit(points[:,0],points[:,1],1)
2 plot(points[:,0],points[:,1],'.')
3 plot([0,512],[b,m*512+b])
```



```
1 pred = m*points[:,0]+b
2 inlier = (abs(pred-points[:,1])<100)
3 plot(points[inlier,0],points[inlier,1],'.')
```




```
1 m,b = polyfit(points[inlier,0],points[inlier,1],1)
2 plot(points[:,0],points[:,1],'.')
3 plot([0,512],[b,m*512+b])
```



RANSAC

RANSAC:

The idea behind RANSAC is the following:

- ▶ try a whole bunch of different line parameters
- ▶ determine which line matches the data best
- ▶ return those line parameters

Finding candidate lines:

- ▶ take any two points
- ▶ determine the line through them
- ▶ evaluate all the remaining points relative to that line

Evaluation of points:

- ▶ simple: if the point is within some error bound from the line it counts
- ▶ better: a smooth falloff $q = \max(1 - \frac{\delta^2}{\epsilon^2}, 0)$

evaluating a set of line parameters

```
1 def evaluate(points,m,b,eps=20):  
2     count = 0  
3     for x,y in points:  
4         error = abs(y-(m*x+b))  
5         count += max(1-error**2/eps**2,0)  
6     return count
```

RANSAC

```
1 best = None
2 best_q = 0
3 for trial in range(10000):
4     x0,y0 = points[randint(0,len(points)-1)]
5     x1,y1 = points[randint(0,len(points)-1)]
6     if abs(x1-x0)<5: continue
7     m = (y1-y0)/(x1-x0)
8     b = y0-m*x0
9     q = evaluate(points,m,b)
10    if q>best_q:
11        best_q = q
12        best = (m,b)
13    print best_q,best
```

```
2.0 (-1.3421052631578947, 319.4736842105263)
10.0765766632 (1.015748031496063, 12.952755905511822)
10.9286148148 (1.0444444444444445, 1.9333333333332803)
11.1182718561 (1.0110294117647058, 9.128676470588232)
11.1569616826 (1.0136054421768708, 8.2244897959183731)
11.1746508366 (1.0150943396226415, 6.3094339622641655)
11.18229216 (1.032, 1.7680000000000007)
11.2197590203 (1.0209205020920502, 5.6569037656903731)
```

```
1 m,b = best
2 plot(points[:,0],points[:,1],'.')
3 plot([0,512],[b,m*512+b], 'g-')
```

