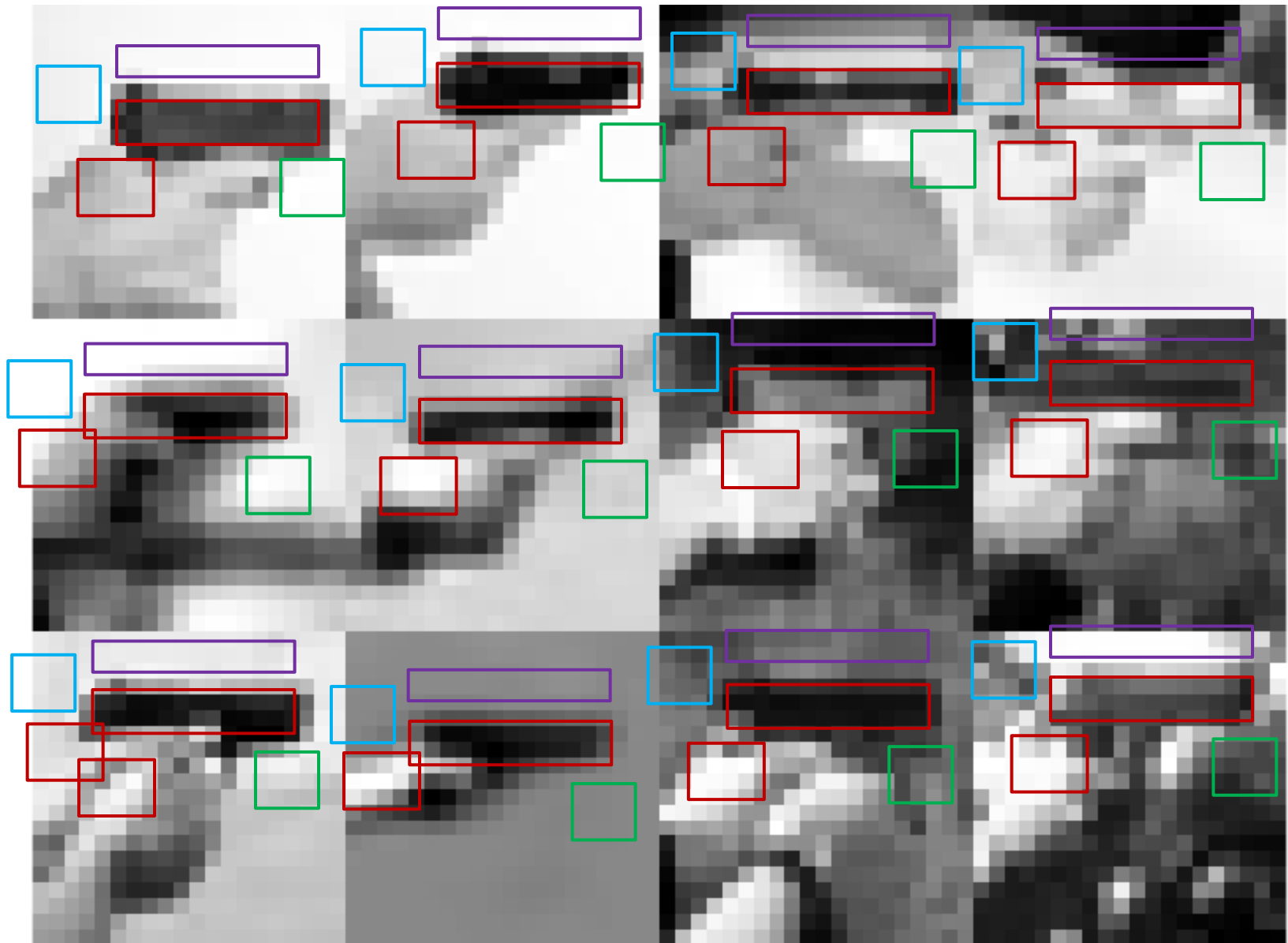


Gun Detection Algorithm

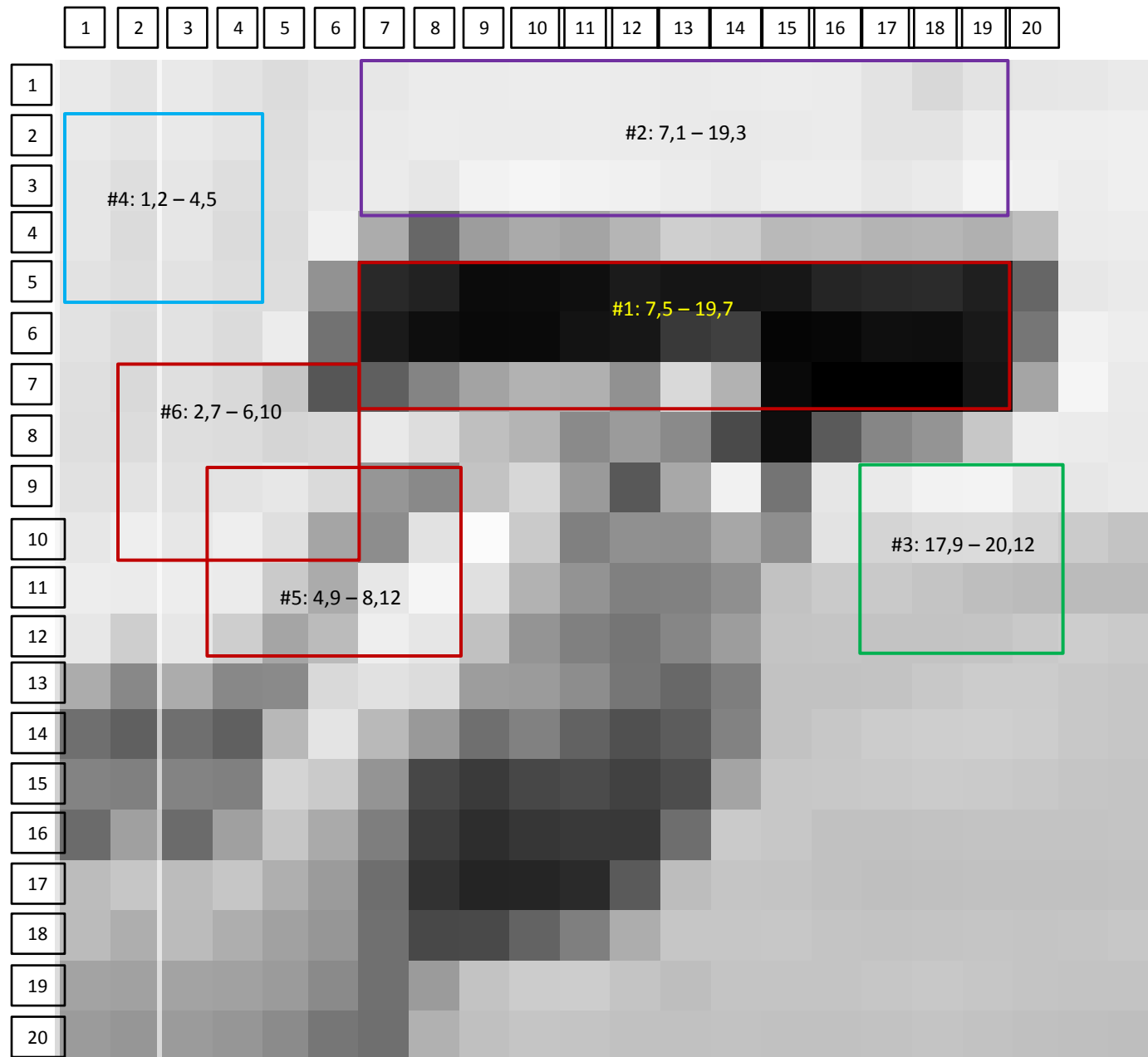


Collage of handgun images

Templates – Take 1



Gun Template – Take 1



Matching Gun Template



Scale = 0.167. Number of matches = 12.

Matching Gun Template

```
MATLAB > Seecure
Editor - C:\Users\ilya\Documents\MATLAB\Seecure\testGuns06.m
testGigE_CL_R2014a_Basler.m  testGigE_CL_R2014a_Basler_8.m  template_me
6 - prefix = 'C:\Users\ilya\Saphicon\Seecure\Images\Guns\w
7 - suffix = '.jpg';
8 - scale = 0.3333;
9
10 %% Read
11 name = [prefix num2str(framenum,'%03.0f') suffix];
12 a0 = imread(name);
13 a0 = imresize(a0,scale);
14 figure(1); imshow(a0);
15
16 %% Integral image
17 iimg = integralImage(a0);
18 %figure(2); imshow(uint8(255*iimg./max(max(iimg))));
19
20 %% Template
21 tpl = [ ... % top left bottom right
22        [5 7 7 19]; ...
23        [1 7 3 19]; ...
24        [9 17 12 20]; ...
25        [2 1 5 4]; ...
26        [9 4 12 8]; ...
27        [7 2 10 6] ...
28        ];
29 tpl = tpl*2;
30 tpl_ye = max(tpl(:,3));
31 tpl_xe = max(tpl(:,4));
32 %% Calculate
33 [coords, rect_means] = template_means(iimg, tpl);
34
35 %% Test
36 thresh = 90; %80-130
37 flt = test_template(coords, rect_means, thresh);
38
39 %% Display
40 figure(1); imshow(a0);
41 for i = 1 : size(flt,1)
42     rt = flt(i,1); r1 = flt(i,2);
43     rectangle('Position',[r1 rt tpl_xe tpl_ye], 'EdgeC
Command Window
>> size(flt,1)
ans =
52
>>
```



Scale = 0.333. Number of matches = 52.

Matching Gun Template

```
MATLAB > Seecure
Editor - C:\Users\ilya\Documents\MATLAB\Seecure\testGuns06.m
testGigE_CL_R2014a_Basler.m testGigE_CL_R2014a_Basler_8.m

1  %%testGuns06
2  %% Prepare
3  close all
4  clear all
5  framenum = 35;
6  prefix = 'C:\Users\ilya\Saphicon\Seecure\';
7  suffix = '.jpg';
8  scale = 0.5; %0.3333;
9
10 %% Read
11 name = [prefix num2str(framenum, '%03.0f')];
12 a0 = imread(name);
13 a0 = imresize(a0, scale);
14 figure(1); imshow(a0);
15
16 %% Integral image
17 iimg = integralImage(a0);
18 %figure(2); imshow(uint8(255*iimg./max(max(iimg,[],[]))));
19
20 %% Template
21 tpl = [ ... % top left bottom right
22        [5 7 7 19]; ...
23        [1 7 3 19]; ...
24        [9 17 12 20]; ...
25        [2 1 5 4]; ...
26        [9 4 12 8]; ...
27        [7 2 10 6] ...
28        ];
29 tpl = tpl*3; %2;
30 tpl_ye = max(tpl(:,3));
31 tpl_xe = max(tpl(:,4));
32 %% Calculate
33 [coords, rect_means] = template_means(iimg, tpl);
34
35 %% Test
36 thresh = 90; %80-130
37 flt = test_template(coords, rect_means, thresh);
38
39 %% Display
40
Command Window
>> size(flt,1)

ans =

    123

fx >>
```



Scale = 0.5. Number of matches = 123.

Matching Gun Template

```
MATLAB > Seecure
Editor - C:\Users\ilya\Documents\MATLAB\Seecure\testGuns06.m
testGigE_CL_R2014a_Basler.m  testGigE_CL_R2014a_Basle

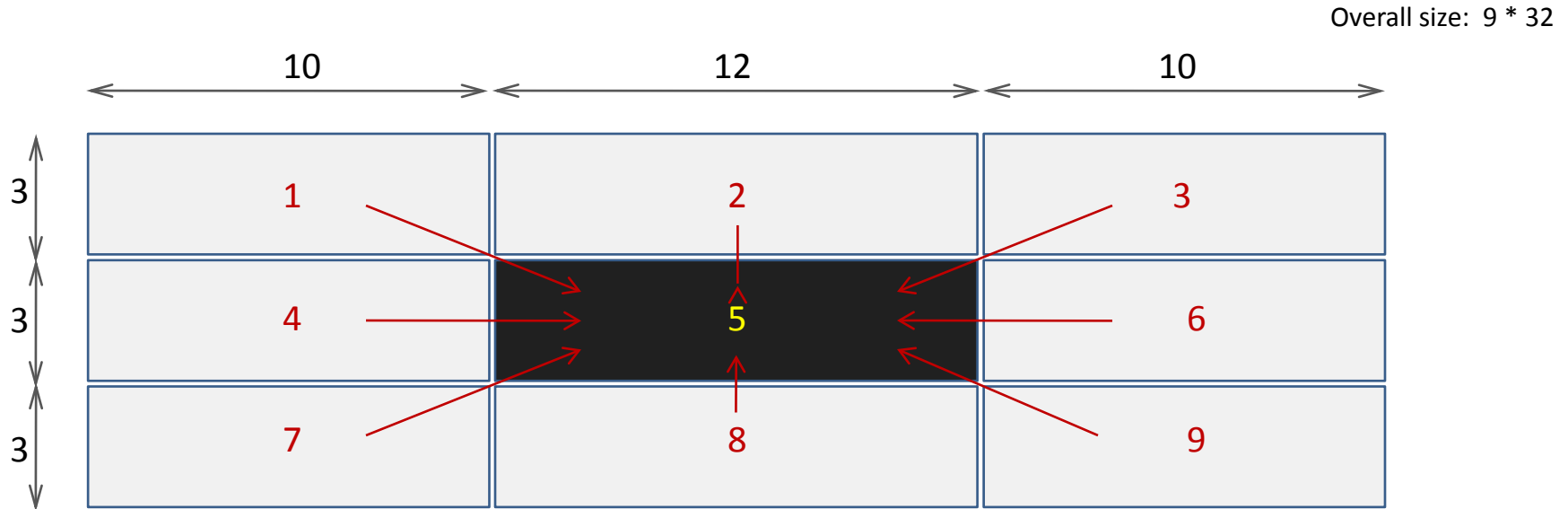
1  %testGuns06
2  %% Prepare
3  close all
4  clear all
5  framenum = 35;
6  prefix = 'C:\Users\ilya\Saphicon\Seecure\testGuns06\';
7  suffix = '.jpg';
8  scale = 1; %0.5; 0.3333;
9
10 %% Read
11 name = [prefix num2str(framenum, '%03d') suffix];
12 a0 = imread(name);
13 a0 = imresize(a0, scale);
14 figure(1); imshow(a0);
15
16 %% Integral image
17 iimg = integralImage(a0);
18 %figure(2); imshow(uint8(255*iimg./max(iimg(:,:))));
19
20 %% Template
21 tpl = [ ... % top left bottom right
22        [5 7 7 19]; ...
23        [1 7 3 19]; ...
24        [9 17 12 20]; ...
25        [2 1 5 4]; ...
26        [9 4 12 8]; ...
27        [7 2 10 6] ...
28        ];
29 tpl = tpl*6; %3; 2;
30 tpl_ye = max(tpl(:,3));
31 tpl_xe = max(tpl(:,4));
32 %% Calculate
33 [coords, rect_means] = template_means(tpl, iimg);
34
35 %% Test
36 thresh = 100; %80-130
37 flt = test_template(coords, rect_means, thresh);
38
39 %% Display
40
41 Command Window
42
43 >> size(flt,1)
44
45 ans =
46
47 402
48
49 >>
```



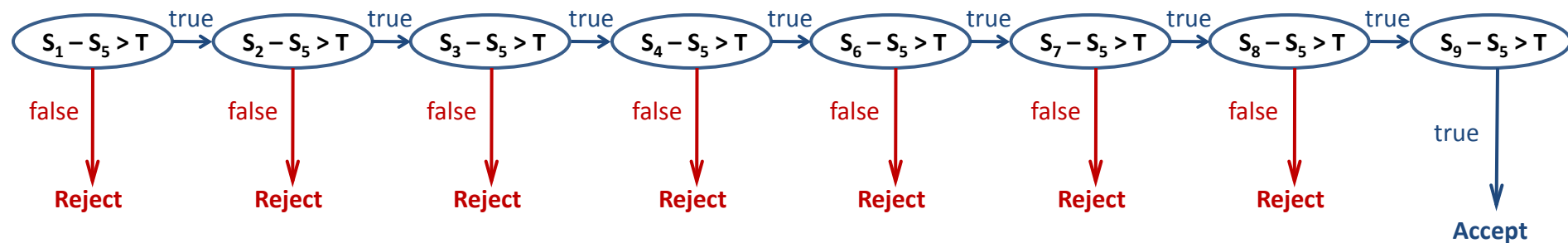
Scale = 1. Number of matches = 402.

Gun Template – Take 2.

Narrow formulation: looking for black handgun barrels

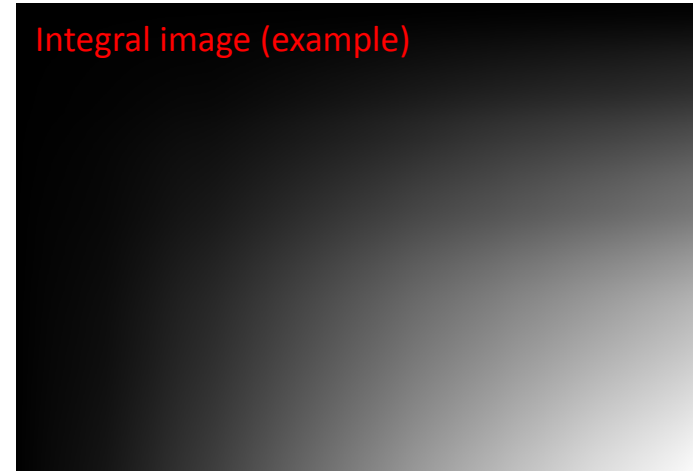
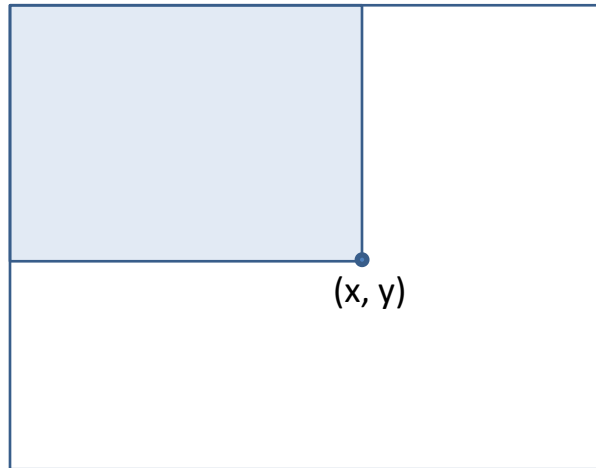


Calculate average image intensity (S) in each of the 9 rectangles and compare it between 8 peripheral and the middle rectangle. The difference has to be greater than threshold (T).

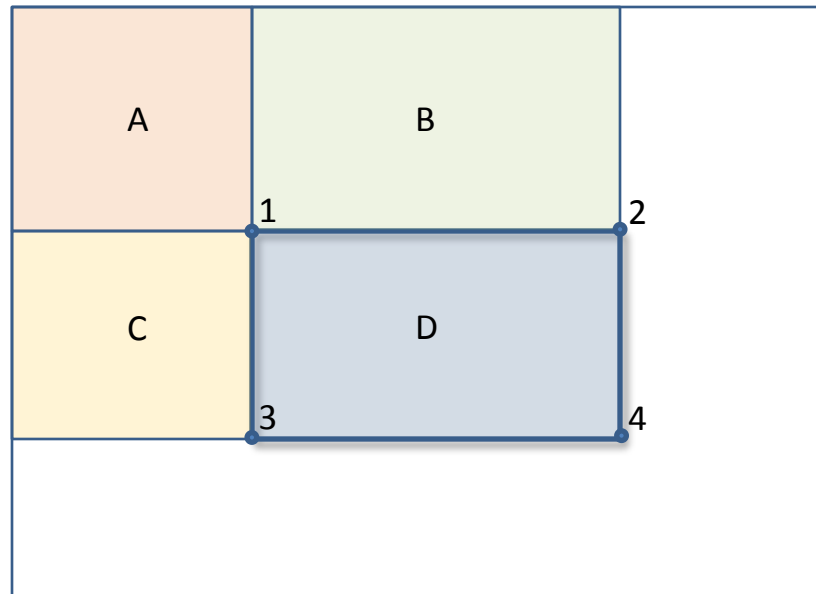


Rejection happens as early as possible.

Rectangle Averages through Integral Image (Viola-Jones)



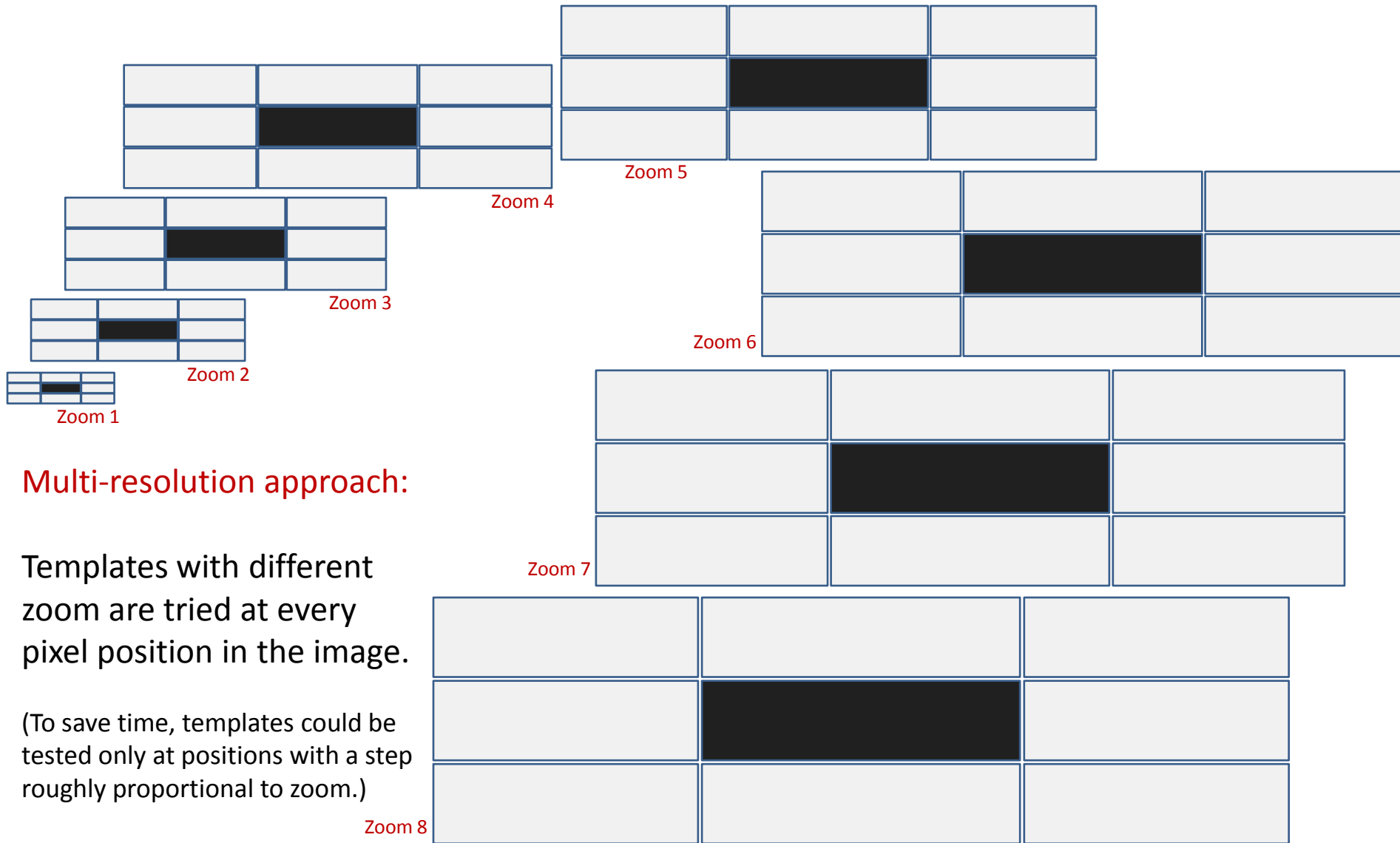
Definition: The value of the integral image at point (x, y) is the sum of all pixels of the original image above and to the left. The integral image is pre-computed once for all further analysis.



The sum (S) of pixels within rectangle D can be computed with four references into the integral image (I).

$$S_D = I_4 + I_1 - I_2 - I_3$$

Zooming Gun Template



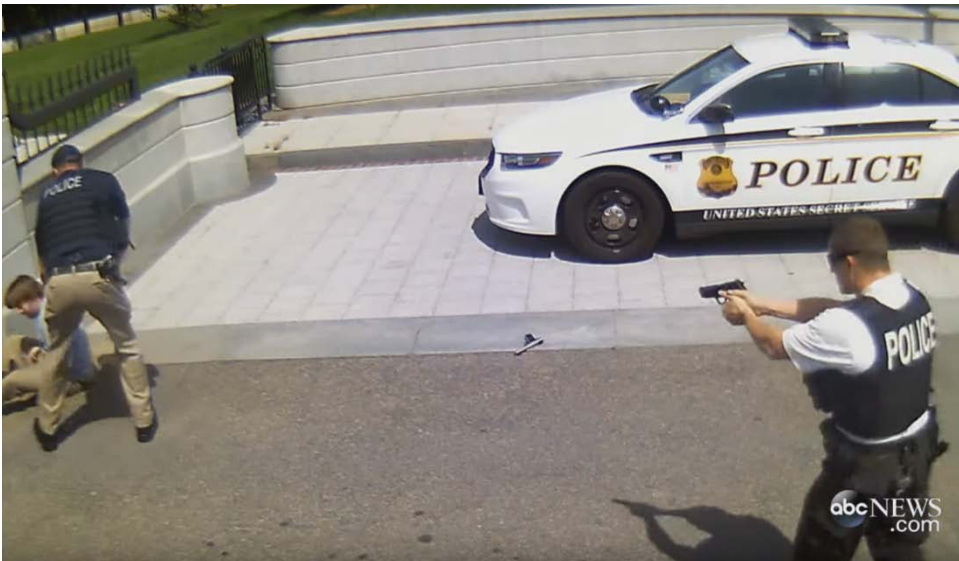
Images for Testing



<https://www.youtube.com/watch?v=MqRZ-zRFsU>



<https://www.youtube.com/watch?v=pkRofcvfnHg>



<https://www.youtube.com/watch?v=dBlInaSKVfQ>



<https://www.youtube.com/watch?v=VAedmsJ-Fb0>

Our approach vs. Viola-Jones

Our method (for guns)	Viola-Jones (for faces)
Template consists of as many rectangles as needed.	Each feature is computed on two rectangles.
Variations of objects are detected by different templates. Accepts only tight matches.	Removes wrong candidates in successive cascades of classifier.
Low false-positive. Moderate false negative (improved by adding templates).	High false-positive (improved by cascade). Low false negative.
Slower to execute (as of now).	Faster to execute.
No image library is needed and there is no training.	Needs large library of images for training.

Example 1



```
zoom = 4;  
thresh = 70;  
step = 2;  
template = zoom * form_template_9 (3, 12, 10);  
matches = match_template (img, template, thresh, step);  
cluster = cluster_template (matches);
```



Several **matches** are detected for the same object, which are then combined into a single **cluster**.

AN INSTANT
AZEN ATTACK ON POLITICIAN

Clusters from different template
zoom are shown in colors



Loop by:	zoom	thresh	step
	3	70	2
	4	70	2



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AZEN ATTACK ON POLITICIAN

abc NEWS

Example 2



```
zoom = 7;  
thresh = 70;  
step = 2;  
template = zoom * form_template_9 (3, 12, 10);  
matches = match_template (img, template, thresh, step);  
cluster = cluster_template (matches);
```



Several **matches** are detected for the same object, which are then combined into a single **cluster**.



Clusters from different template zoom are shown in colors →

Loop by:	zoom	thresh	step
6	70	3	
7	70	3	
8	70	3	
9	70	3	

Example 3



```
zoom = 6;
thresh = 80;
step = 3;
template = zoom * form_template_9 (3, 12, 10);
matches = match_template (img, template, thresh, step);
cluster = cluster_template (matches);
```

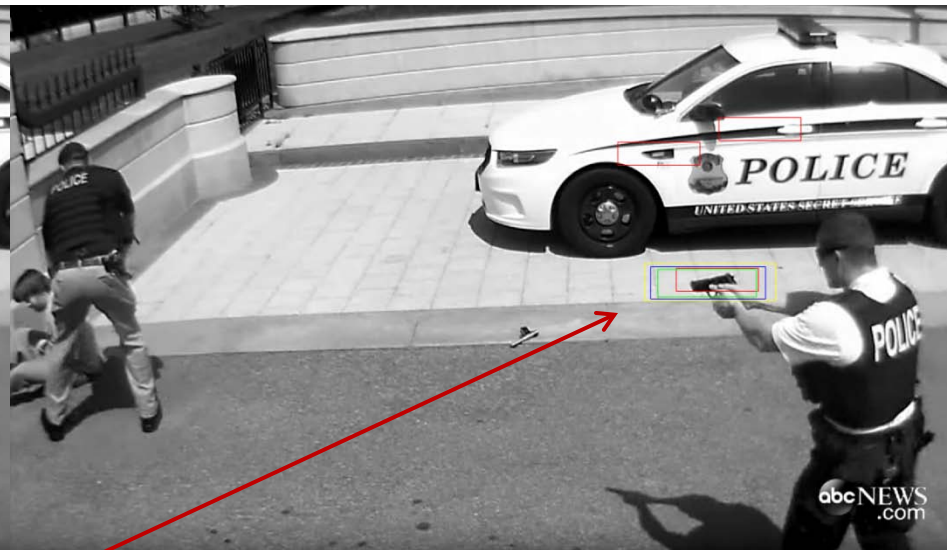


Several **matches** are detected for the same object, which are then combined into a single **cluster**.



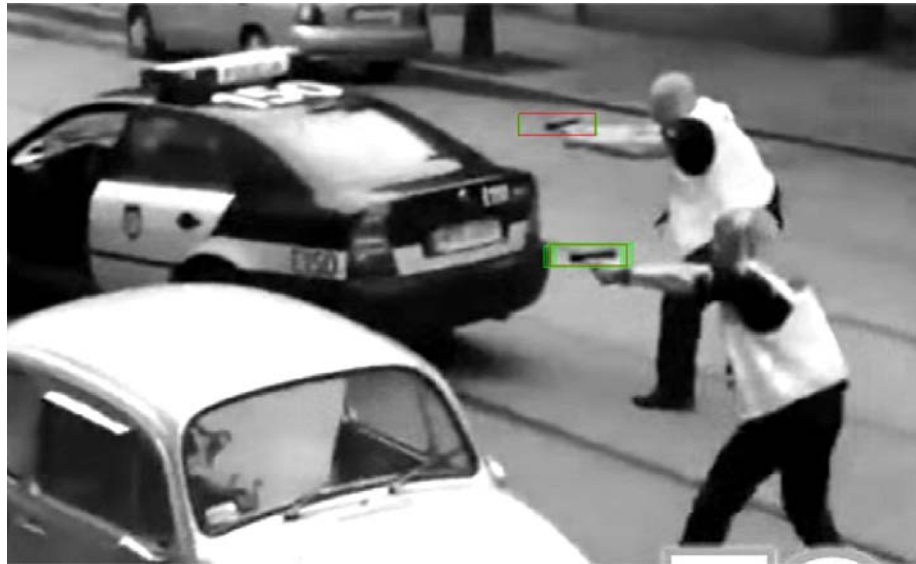
Loop by:	zoom	thresh	step
6	80	3	
7	80	3	
8	80	3	

Clusters from different
template zoom are shown
in colors



Loop by:	zoom	thresh	step
5	80	3 (this zoom generates 2 false-positives)	
6	80	3	
7	80	3	
8	80	3	

Example 4



```
zoom = 2;
thresh = 57;
step = 2;
template = zoom * form_template_9 (3, 12, 10);
matches = match_template (img, template, thresh, step);
cluster = cluster_template (matches);
```



Several **matches** are detected for the same object, which are then combined into a single **cluster**.



Loop by:

zoom	thresh	step
1.75	55	1
2	57	2
2.5	65	2

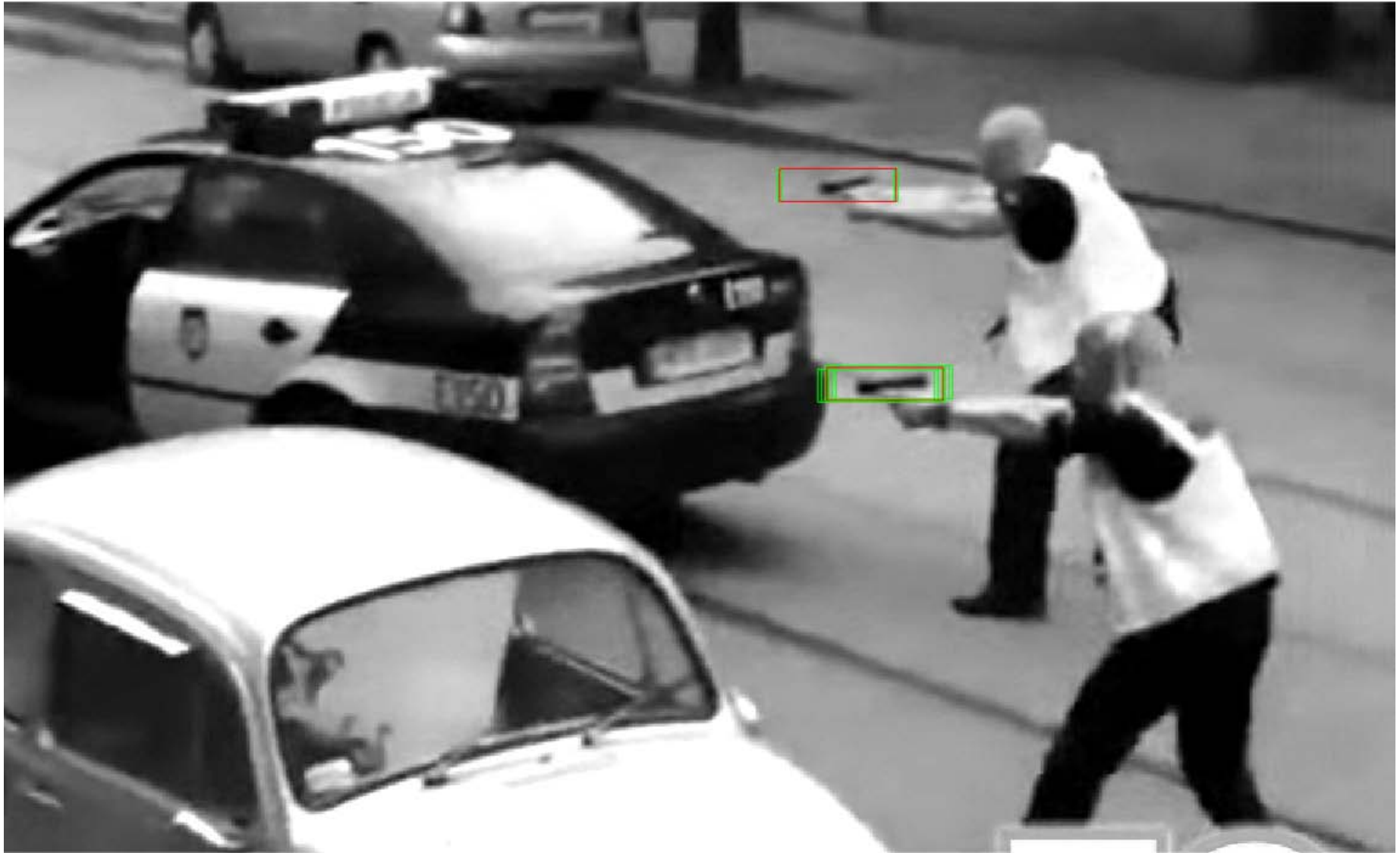
Clusters from different
template zoom are shown
in colors



Loop by:

zoom	thresh	step
1.5	50	1 (this zoom generates 2 false-positives)
1.75	55	1
2	57	2
2.5	65	2

Example 4 (1)



```
zoom = 2;  
thresh = 57;  
step = 2;  
template = zoom * form_template_9 (3, 12, 10);  
matches = match_template (img, template, thresh, step);  
cluster = cluster_template (matches);
```

Several **matches** are detected for the same object, which are then combined into a single **cluster**.

Example 4 (2)



Loop by:	zoom	thresh	step
	1.75	55	1
	2	57	2
	2.5	65	2

Clusters from different template zoom are shown in colors

Example 4 (3)



Loop by: zoom thresh step

1.5 50

1 This zoom generates 2 false-positives (not counting false-positives generated by text superimposed on image)

1.75 55

1

2 57

2

2.5 65

2

Clusters from different template zoom are shown in colors

Example 5

```
zoom = 8;  
thresh = 65;  
step = 3;  
template = zoom * form_template_9 (3, 12, 10);  
matches = match_template  
            (img, template, thresh, step);  
cluster = cluster_template (matches);
```

← Several **matches** are detected for the same object, which are then combined into a single **cluster**.



Clusters from different template zoom are shown in colors →

Loop by:	zoom	thresh	step
	7	63	3
	8	65	3
	9	65	3



Example 6 – Using Sequences of Images



```
scale = 0.5;  
zoom = 1;  
thresh = 70;  
step = 1;  
template = zoom * form_template_9 (6,12,6);  
matches = match_template (img, template, thresh, step);  
cluster = cluster_template (matches);
```

Sometimes it is hard to eliminate false positives. Analyzing motion can provide a solution.

Example 6 – Optical Flow

Frame 1



Frame 2



```
opticFlow = opticalFlowHS;           % Create optical flow object
estimateFlow (opticFlow,frame1);      % Initialize
% Calculate optical flow from frame 1 to frame 2
flow = estimateFlow (opticFlow,frame2);
```

Example 6 – Finding Guns in Areas of Motion

Look for gun templates only in the areas of movement defined by the mask



% Use magnitude of optical flow
fm = flow.Magnitude;

% Convert to a binary mask
m1 = im2bw(fm,0.01);

% Clean up the mask
m2 = bwareafilt(m1,[minarea maxarea]);
m3 = imfill(m2,'holes');

False-positive is eliminated



Range of Parameters

Zoom	1-1.5	2-2.5	≥ 3
Threshold	~50	50-60	70-80
Step	1	2	>2

Conclusion

- The algorithm can handle rotation within ± 10 degrees, but results are more reliable when barrel is horizontal.
- Need to know the approximate scale, either from the distance between the camera and the object, or derived from the image by independent means.
- Matches with different zoom can be used for confirmation of finding.
- Speed?
- Stability with parameters?
- This algorithm was fast to develop and used a minimal image library.

Next Steps

- Include rotation +/- 20 degrees.
- Analyze shape of candidate objects to reduce false positives and allow more freedom in setting parameters.
- Leverage existing methods based on learning, e.g., use proximity to head/ upper body/ face.
- Create templates for other types and colors of guns.
- Perform preprocessing (contrasting, color correction) to improve gun detection