

# 02\_CAMSHIFT

April 15, 2018

## 1 Assignment 2: CAMSHIFT

### 1.1 Paper

Lies das Paper “Bradski\_etal\_1998\_camshift.pdf” im KVV (unter “Resources”).

### 1.2 Histogramm berechnen

- Implementiere eine Funktion, die ein Farbhistogramm erstellt. Übergebe entweder ein Bild und ein ROI, oder das dem ROI unterliegende Bild.
- Hierzu ermögliche durch die Übergabe eines zweiten (bzw. dritten) Parameters die Zusammenfassung von Farbwerten in n Bins.
- Lade das Bild “images/racecar.png” und konvertiere das Bild in den HSV-Farbraum. Plote den Hue-Kanal. (**RESULT**)

In [1]: *# dieser Code wurde als Musterlösung von Tobias Schülke zur Verfügung gestellt und von*

```
%matplotlib inline
from skimage import io,color
import numpy as np
from matplotlib import pyplot as plt
import matplotlib.patches as patches
import os
import warnings; warnings.simplefilter('ignore')
import math

IMAGES_PER_ROW = 4

MIN_SATURATION_CAR = 0.2
MIN_VALUE_CAR = 0.5
MIN_SATURATION_TACO = 0.8
MIN_VALUE_TACO = 0.2

ROI_FRAME_MARGIN_CAR = 60
ROI_FRAME_MARGIN_TACO = 20

image = io.imread('images/racecar.png')
imageCar = image[260:350, 480:640]
```

```

# ...

def createColorHistogram(img, binCount = 256, out = plt):
    roi = color.rgb2hsv(img)
    invalid = 0 #ToDo
    #initialize list for plotting
    pixel = []
    #search and count pixel hues
    for x in range(roi.shape[0]):
        for y in range(roi.shape[1]):
            hue = roi[x][y][0]
            pixel.append(hue)

    #fig, axs = out.subplots()
    n, bins, patches = out.hist(pixel, binCount, facecolor='g', alpha=0.75)

    bar_colors = []

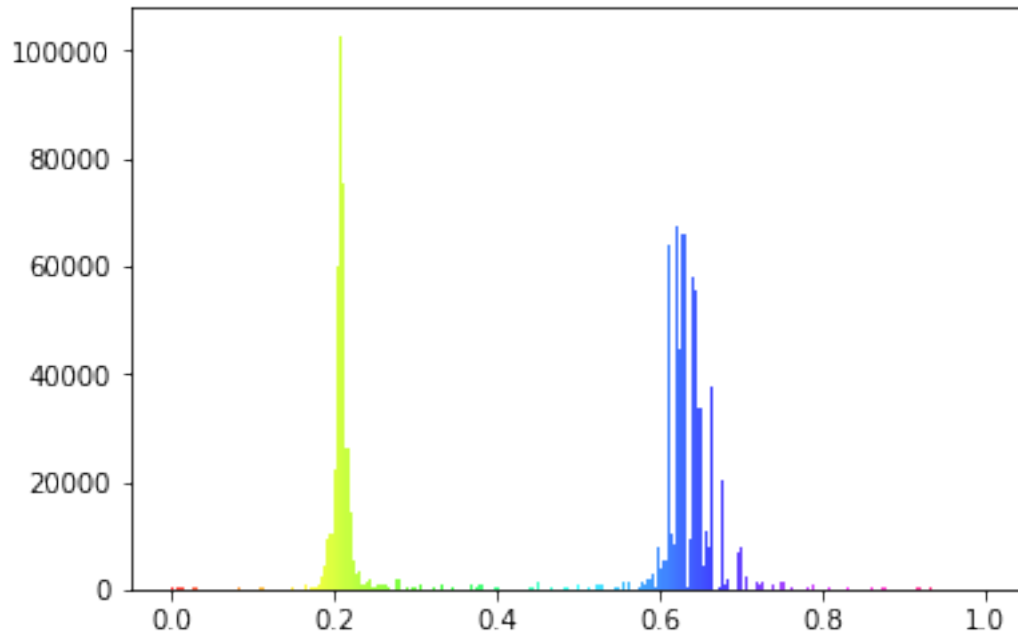
    # prepare color list for the bucket colors
    for i in range(binCount):
        current_bin_color_hsv = np.array([[i/float(binCount), 1, 1]], dtype=np.float)
        bar_color_rgb = color.hsv2rgb(current_bin_color_hsv)
        bar_color_rgb_norm = (bar_color_rgb[0][0][0], bar_color_rgb[0][0][1], bar_color_rgb[0][0][2])
        bar_colors.append(bar_color_rgb_norm)

    # set bucket colors
    for thispatch, i in zip(patches, range(binCount)):
        thispatch.set_facecolor(bar_colors[i])
    return n, bins, patches

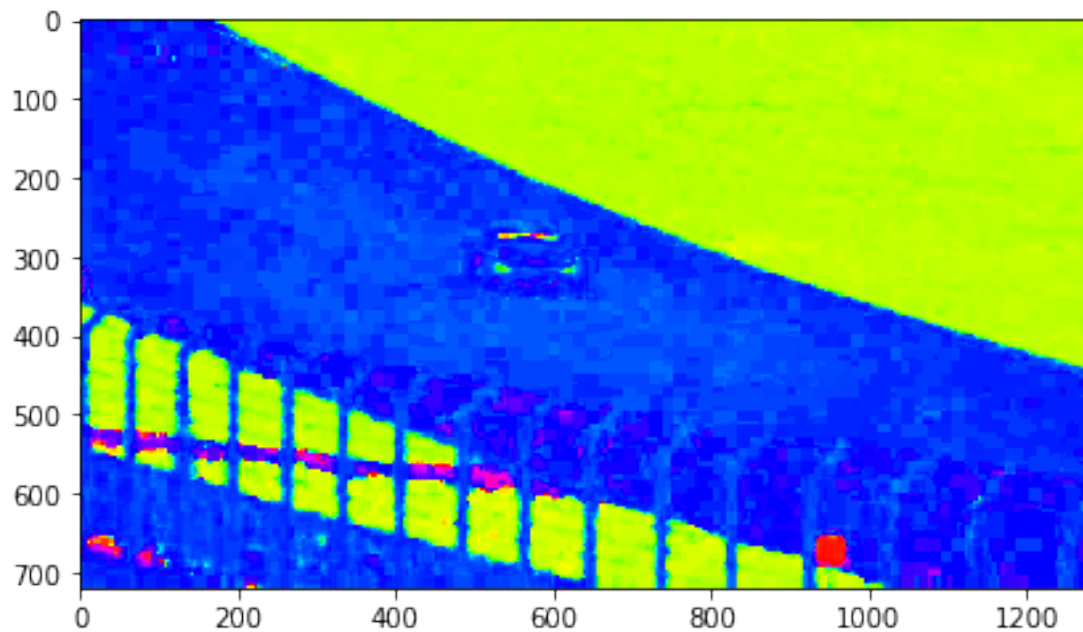
createColorHistogram(image)
plt.show()

img_hsv = color.rgb2hsv(image)
img_hsv[:, :, 1] = 1
img_hsv[:, :, 2] = 1
img_rgb = color.hsv2rgb(img_hsv)
io.imshow(img_rgb)

```



Out[1]: <matplotlib.image.AxesImage at 0x12713db9ef0>



- stelle das Histogramm über dem Hue-Kanal für das gesamte Bild und für den Ausschnitt  $(x,y) = (480, 260)$  bis  $(640, 350)$  dar. Variiere auch mal testweise die Zahl der Bins(**RESULT**)

```

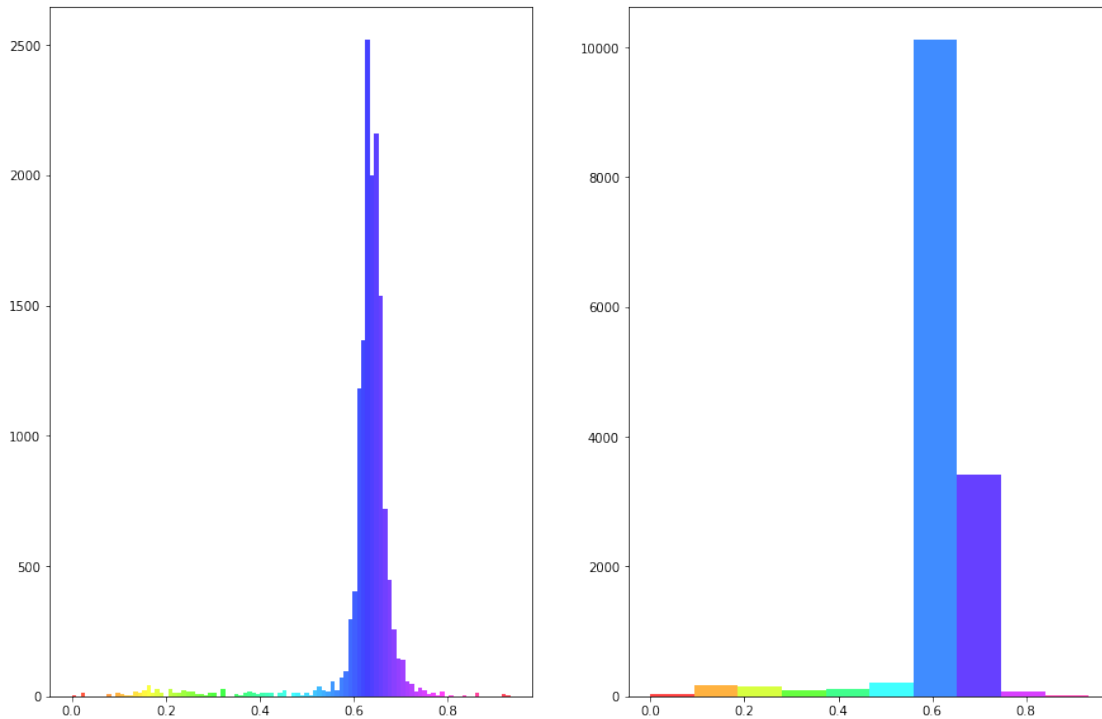
In [2]: fig = plt.figure(figsize=(15, 10))
        ax1 = plt.subplot(1, 2, 1)
        ax2 = plt.subplot(1, 2, 2)

        histCar100 = createColorHistogram(imageCar, 100, ax1)

        histCar10 = createColorHistogram(imageCar, 10, ax2)

        plt.savefig('testbilder/car_100 and_10_bins.png')

```



### 1.3 Wahrscheinlichkeitsverteilung

- implementiere die Methode aus der Vorlesung, die Dir - gegeben ein Hue-Histogramm - die Objekt-Wahrscheinlichkeitsverteilung für ein neues Bild berechnet.
- erzeuge das Histogramm des Autos aus dem Bild “racecar.png” und wende die neue Funktion auf das letzte frame des Videos (images/racecar/151.jpg) an (**RESULT**)

```

In [61]: def calculateProbFor(pixel_hsv, nHist, nbins, minSaturation, minValue):
        if (pixel_hsv[1] < minSaturation) or (pixel_hsv[2] < minValue):
            return -1

        mass_of_histogramm = np.sum(nHist)
        current_hue = pixel_hsv[0]
        current_bin = math.floor(current_hue*nbins)

```

```

    number_of_counts = nHist[current_bin]
    relative_frequency = number_of_counts/mass_of_histogramm
    return relative_frequency

'''MIN_SATURATION_CAR = 0.2
MIN_VALUE_CAR = 0.5
MIN_SATURATION_TACO = 0.8
MIN_VALUE_TACO = 0.2'''
#Low and high thresholds are
#set off 10% of the maximum pixel value

# Tipp: in der Nacht sind alle Katzen grau ;)
def createProbDistribution(image, objectHist, nbins, minSaturation, minValue, searchBlock):
    probBlockSizeX, probBlockSizeY = searchBlock
    pixelPerProbBlock = probBlockSizeX*probBlockSizeY

    probDistribution = np.empty_like(image)
    #initialize probDistribution with color
    probDistribution[:, :, 0] = 200
    probDistribution[:, :, 1] = 0
    probDistribution[:, :, 2] = 255

    countBlocksX = math.floor(probDistribution.shape[1]/probBlockSizeX)
    countBlocksY = math.floor(probDistribution.shape[0]/probBlockSizeY)
    image_hsv = color.rgb2hsv(image)
    n, bins, patches = objectHist

    for currentBlockX in range(countBlocksX):
        x = currentBlockX * probBlockSizeX
        for currentBlockY in range(countBlocksY):
            y = currentBlockY * probBlockSizeY

            #iterate over area
            probPerArea = 0
            currentPixelPerBlock = pixelPerProbBlock
            for a in range(probBlockSizeX):
                for b in range(probBlockSizeY):
                    current_pixel = image_hsv[y+b][x+a]
                    probability = calculateProbFor(current_pixel, n, nbins, minSaturation, minValue)
                    if (probability < 0):
                        currentPixelPerBlock-=1
                    else:
                        probPerArea += probability

            try:
                probPerArea = probPerArea/currentPixelPerBlock
                probInGrey = np.array([probPerArea,probPerArea,probPerArea])*255
            except ZeroDivisionError: # if all pixels are invalid set the probability to 0

```

```

        probInGrey = np.array([0,0,0])

        #color area with probability
        probDistribution[y:y+probBlockSizeY, x:x+probBlockSizeX] = probInGrey
    return probDistribution

lastFrame = io.imread('images/racecar.png')

#lastFrame = io.imread('images/taco/001.jpg')
#face = lastFrame[160:280, 320:450]

nbins = 25 #20 to 80
#histogramFace = createColorHistogram(face, nbins, ax1)
histogramCar = createColorHistogram(imageCar, nbins, ax1)
searchBlock = (20, 20)

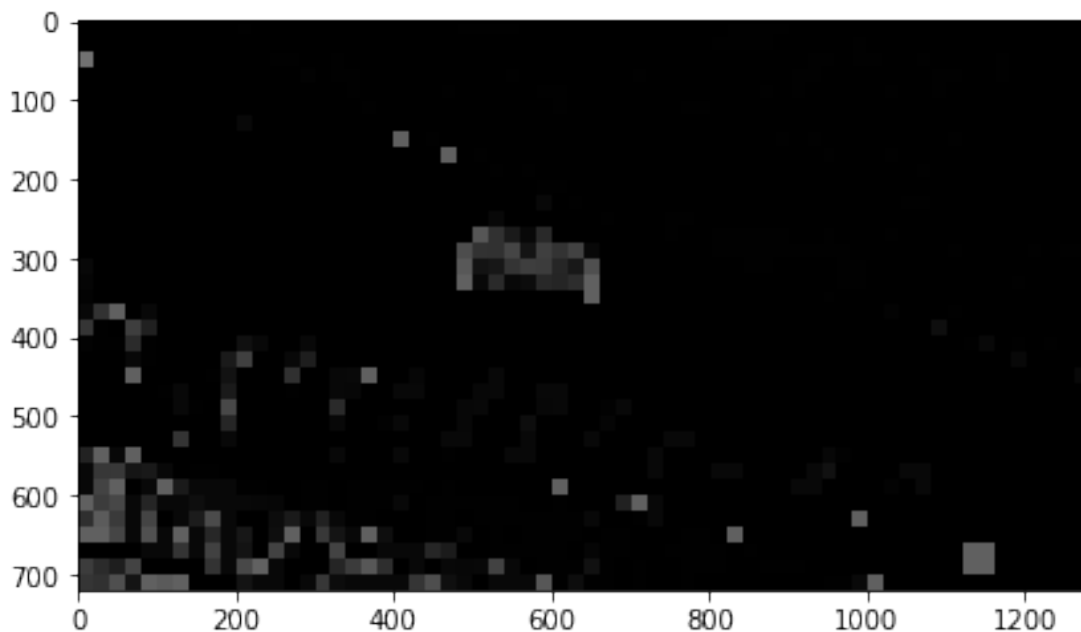
MIN_SATURATION_CAR = 0.2
MIN_VALUE_CAR = 0.5

probDistr = createProbDistribution(lastFrame, histogramCar, nbins, MIN_SATURATION_CAR)

io.imshow(probDistr)

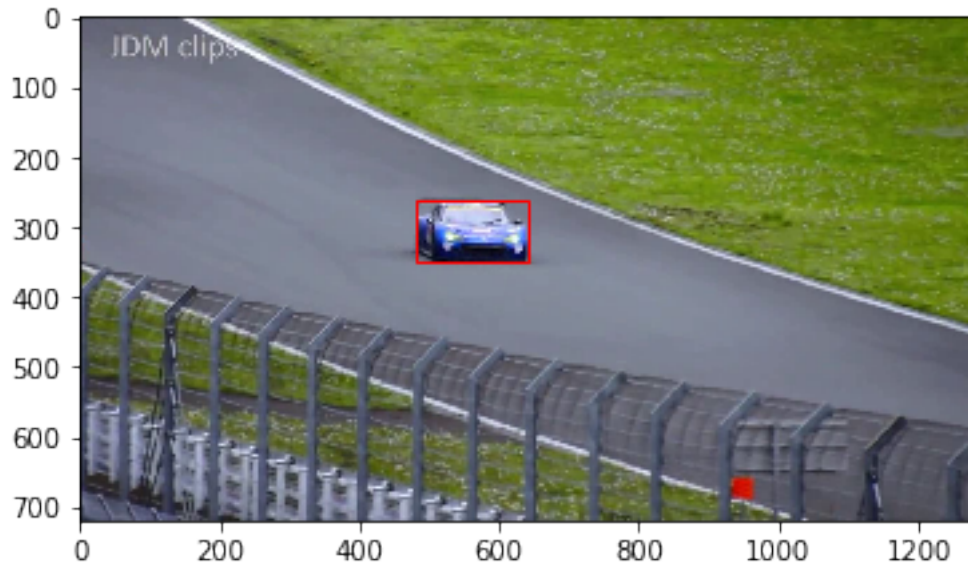
```

Out[61]: <matplotlib.image.AxesImage at 0x1271fc85390>



### 1.3.1 ROI auf Bild anzeigen

```
In [4]: def drawROI(image, x, y, width, height, out = plt):  
        currentAxis = plt.gca()  
        currentAxis.add_patch(  
            patches.Rectangle(  
                (x, y),  
                width,  
                height,  
                fill=False,  
                edgecolor="red"  
            )  
        )  
  
        out.imshow(image)  
  
drawROI(image, 480, 260, 160, 90)
```



### 1.4 Exercise 1.2 - Mean Shift

- Implementiere die Verschiebung und des ROI wie in der Vorlesung beschrieben. Teste den Algorithmus auf den Bildfolgen "images/racecar/\*.jpg" oder "images/taco/\*.jpg". Wähle das Tracking-Fenster geeignet (zur Reduktion der Dateigröße habe ich die Bilder um Faktor 2 verkleinert, d.h. die ROI von oben muss entsprechend angepasst werden).
- Zeichne als Ausgabe die Trajektorie (die Bewegungsspur) der Objekte, wie durch CAMSHIFT zurückgegeben. (**RESULT**)

```
In [107]: from scipy import ndimage  
          nbins = 25 #20 to 80
```

```

histogramCar = createColorHistogram(imageCar, nbins)
searchBlock = (10, 10)
#io.imshow(image[260:350, 480:640])
#oberer Rand:unterer Rand, linkerRand:rechter Rand

def meanShift(probImage, initialLeftCorner, initialWidth, initialHeight, out = plt):
    initX, initY = initialLeftCorner
    relativeCenter = (initialWidth/2, initialHeight/2)
    searchWindow = probImage[initY:initY+initialHeight,
                             initX: initX+initialWidth]
    lastLeftCorner = initialLeftCorner
    threshold = 4
    shiftAmount = threshold + 10
    #drawROI(probImage, lastLeftCorner[0], lastLeftCorner[1], initialWidth, initialH

    while shiftAmount > threshold:
        x,y,z = ndimage.measurements.center_of_mass(searchWindow)
        newRelativeCenter = (y, x) # https://github.com/scipy/scipy/issues/3040

        if not math.isnan(x) and not math.isnan(y):
            newShift = [new - old for new, old in zip(newRelativeCenter, relativeCenter)]
        else:
            newShift = [0, 0]

        newLeftCorner = [int(round(old_corner+ shift)) for old_corner, shift in zip(

        shiftAmount = math.sqrt(newShift[0]**2 + newShift[1]**2)
        searchWindow = probImage[newLeftCorner[1]:
                                newLeftCorner[1]+initialHeight,
                                newLeftCorner[0]:
                                newLeftCorner[0]+initialWidth]

        lastLeftCorner = newLeftCorner
    return (max(0,lastLeftCorner[0]), max(0, lastLeftCorner[1]))

def meanshift():
    lastFrame = io.imread('images/racecar/151.jpeg')
    sizeX = 80
    sizeY = 45
    fileNumber = []
    leftCorner = (240, 130)

    for i in range(10):
        fileNumber.append('00{0}'.format(str(i)))
    for i in range(11, 99):
        fileNumber.append('0{0}'.format(str(i)))
    for i in range(100, 152):
        fileNumber.append('{0}'.format(str(i)))

```



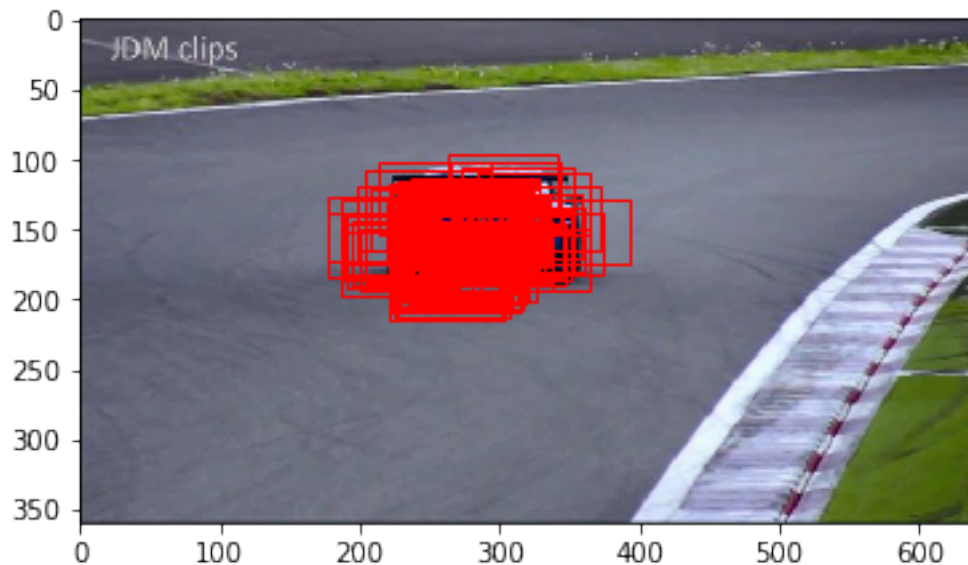
```

for fileNr in fileNumber:
    file = 'images/racecar/{0}.jpeg'.format(fileNr)
    currentFrame = io.imread(file)
    probDistr = createProbDistribution(currentFrame, histogramCar, nbins, MIN_SA)
    x, y = meanShift(probDistr, (240, 130), 80, 45)
    drawROI(lastFrame, x, y, 80, 45)

    plt.gca().clear()
    #drawROI(currentFrame, x, y, 80, 45)
    #plt.savefig('results/meanshift_car/{0}'.format(fileNr)) # todo

meanshift()

```



## 1.5 Exercise 1.2 - CAMSHIFT

- erweitere Deinen Algorithmus um die Anpassung der Grösse des ROI und das Finden der Objektorientierung
- führe den Algorithmus wieder auf eine der Bildfolgen aus und zeichne eine Ellipse auf das Bild, die die gefundenen Parameter repräsentiert (**RESULT**)

```

In [108]: nbins = 25 #20 to 80
          histogramCar = createColorHistogram(imageCar, nbins)
          searchBlock = (10, 10)

def calculateWindowWidth(probImage):
    zerothMoment = np.sum(probImage[:, :, 0])

```

```

try:
    maxIntensity = np.amax(probImage)
except ValueError:
    maxIntensity = 0.1
return round(2*math.sqrt(zerothMoment/max(maxIntensity, 0.1)))

def camshiftFor(currentFrame, initialLeftCorner, initialWidth, initialHeight, out=plt):
    probDistr = createProbDistribution(currentFrame, histogramCar, nbins, MIN_SATURAT
    leftX, leftY = meanShift(probDistr, initialLeftCorner, initialWidth, initialHeight

    searchWindow = probDistr[leftY:
                                leftY+initialHeight,
                                leftX:
                                leftX+initialWidth]
    size = calculateWindowWidth(searchWindow)
    return leftX, leftY, int(round(size*1.4)), size

def camshift():
    lastFrame = io.imread('images/racecar/151.jpeg')
    sizeX = 80
    sizeY = 45
    fileNames = []
    leftCorner = (240, 130)

    for i in range(10):
        fileNames.append('00{0}.jpeg'.format(str(i)))
    for i in range(11, 99):
        fileNames.append('0{0}.jpeg'.format(str(i)))
    for i in range(100, 152):
        fileNames.append('{0}.jpeg'.format(str(i)))

    for fileNr in fileNames:
        file = 'images/racecar/{0}'.format(fileNr)
        currentFrame = io.imread(file)
        leftX, leftY, sizeX, sizeY = camshiftFor(currentFrame, leftCorner, sizeX, sizeY)
        leftCorner = (leftX, leftY)
        drawROI(lastFrame, leftX, leftY, sizeX, sizeY) # todo

        plt.gca().clear()
        #drawROI(currentFrame, leftX, leftY, sizeX, sizeY)
        plt.savefig('results/camshift_car/{0}'.format(fileNr)) # todo

camshift()

leftX, leftY 238 131

```

initialHeight,initialWidth 45 80  
leftX,leftY 227 111  
initialHeight,initialWidth 79 111  
leftX,leftY 234 107  
initialHeight,initialWidth 82 115  
leftX,leftY 235 112  
initialHeight,initialWidth 81 113  
leftX,leftY 225 109  
initialHeight,initialWidth 88 123  
leftX,leftY 228 110  
initialHeight,initialWidth 88 123  
leftX,leftY 229 115  
initialHeight,initialWidth 87 122  
leftX,leftY 235 115  
initialHeight,initialWidth 76 106  
leftX,leftY 227 112  
initialHeight,initialWidth 94 132  
leftX,leftY 227 119  
initialHeight,initialWidth 87 122  
leftX,leftY 227 121  
initialHeight,initialWidth 84 118  
leftX,leftY 223 122  
initialHeight,initialWidth 86 120  
leftX,leftY 212 129  
initialHeight,initialWidth 91 127  
leftX,leftY 220 135  
initialHeight,initialWidth 84 118  
leftX,leftY 220 138  
initialHeight,initialWidth 96 134  
leftX,leftY 221 139  
initialHeight,initialWidth 91 127  
leftX,leftY 219 137  
initialHeight,initialWidth 94 132  
leftX,leftY 218 137  
initialHeight,initialWidth 94 132  
leftX,leftY 216 133  
initialHeight,initialWidth 97 136  
leftX,leftY 225 140  
initialHeight,initialWidth 89 125  
leftX,leftY 210 136  
initialHeight,initialWidth 101 141  
leftX,leftY 207 135  
initialHeight,initialWidth 102 143  
leftX,leftY 211 139  
initialHeight,initialWidth 104 146  
leftX,leftY 197 139  
initialHeight,initialWidth 107 150  
leftX,leftY 182 135

initialHeight,initialWidth 117 164  
 leftX,leftY 171 133  
 initialHeight,initialWidth 121 169  
 leftX,leftY 179 143  
 initialHeight,initialWidth 114 160  
 leftX,leftY 174 145  
 initialHeight,initialWidth 105 147  
 leftX,leftY 170 139  
 initialHeight,initialWidth 124 174  
 leftX,leftY 180 133  
 initialHeight,initialWidth 116 162  
 leftX,leftY 184 132  
 initialHeight,initialWidth 120 168  
 leftX,leftY 188 128  
 initialHeight,initialWidth 119 167  
 leftX,leftY 200 128  
 initialHeight,initialWidth 120 168  
 leftX,leftY 190 124  
 initialHeight,initialWidth 114 160  
 leftX,leftY 187 111  
 initialHeight,initialWidth 127 178  
 leftX,leftY 186 99  
 initialHeight,initialWidth 127 178  
 leftX,leftY 173 94  
 initialHeight,initialWidth 137 192  
 leftX,leftY 189 85  
 initialHeight,initialWidth 134 188  
 leftX,leftY 201 83  
 initialHeight,initialWidth 135 189  
 leftX,leftY 202 86  
 initialHeight,initialWidth 130 182  
 leftX,leftY 214 88  
 initialHeight,initialWidth 131 183  
 leftX,leftY 215 82  
 initialHeight,initialWidth 134 188  
 leftX,leftY 222 90  
 initialHeight,initialWidth 138 193  
 leftX,leftY 236 85  
 initialHeight,initialWidth 139 195  
 leftX,leftY 226 75  
 initialHeight,initialWidth 162 227  
 leftX,leftY 219 77  
 initialHeight,initialWidth 170 238  
 leftX,leftY 218 76  
 initialHeight,initialWidth 171 239  
 leftX,leftY 233 95  
 initialHeight,initialWidth 179 251  
 leftX,leftY 226 99

initialHeight,initialWidth 189 265  
leftX,leftY 205 135  
initialHeight,initialWidth 221 309  
leftX,leftY 168 110  
initialHeight,initialWidth 265 371  
leftX,leftY 137 104  
initialHeight,initialWidth 286 400  
leftX,leftY 150 104  
initialHeight,initialWidth 305 427  
leftX,leftY 162 98  
initialHeight,initialWidth 312 437  
leftX,leftY 152 112  
initialHeight,initialWidth 300 420  
leftX,leftY 147 108  
initialHeight,initialWidth 312 437  
leftX,leftY 118 107  
initialHeight,initialWidth 323 452  
leftX,leftY 93 93  
initialHeight,initialWidth 344 482  
leftX,leftY 45 83  
initialHeight,initialWidth 360 504  
leftX,leftY 38 78  
initialHeight,initialWidth 359 503  
leftX,leftY 97 54  
initialHeight,initialWidth 366 512  
leftX,leftY 88 76  
initialHeight,initialWidth 305 427  
leftX,leftY 54 76  
initialHeight,initialWidth 305 427  
leftX,leftY 22 71  
initialHeight,initialWidth 305 427  
leftX,leftY 0 47  
initialHeight,initialWidth 323 452  
leftX,leftY 0 34  
initialHeight,initialWidth 335 469  
leftX,leftY 29 27  
initialHeight,initialWidth 331 463  
leftX,leftY 57 17  
initialHeight,initialWidth 347 486  
leftX,leftY 46 5  
initialHeight,initialWidth 360 504  
leftX,leftY 48 3  
initialHeight,initialWidth 366 512  
leftX,leftY 33 2  
initialHeight,initialWidth 380 532  
leftX,leftY 19 5  
initialHeight,initialWidth 380 532  
leftX,leftY 11 14

initialHeight,initialWidth 369 517  
leftX,leftY 0 16  
initialHeight,initialWidth 369 517  
leftX,leftY 0 16  
initialHeight,initialWidth 354 496  
leftX,leftY 8 18  
initialHeight,initialWidth 347 486  
leftX,leftY 2 1  
initialHeight,initialWidth 344 482  
leftX,leftY 16 12  
initialHeight,initialWidth 318 445  
leftX,leftY 0 27  
initialHeight,initialWidth 304 426  
leftX,leftY 0 29  
initialHeight,initialWidth 322 451  
leftX,leftY 0 31  
initialHeight,initialWidth 331 463  
leftX,leftY 0 28  
initialHeight,initialWidth 344 482  
leftX,leftY 0 25  
initialHeight,initialWidth 338 473  
leftX,leftY 0 18  
initialHeight,initialWidth 343 480  
leftX,leftY 0 29  
initialHeight,initialWidth 340 476  
leftX,leftY 0 24  
initialHeight,initialWidth 349 489  
leftX,leftY 0 23  
initialHeight,initialWidth 347 486  
leftX,leftY 0 31  
initialHeight,initialWidth 325 455  
leftX,leftY 0 38  
initialHeight,initialWidth 216 302  
leftX,leftY 17 10  
initialHeight,initialWidth 145 203  
leftX,leftY 87 94  
initialHeight,initialWidth 96 134  
leftX,leftY 8 117  
initialHeight,initialWidth 139 195  
leftX,leftY 27 139  
initialHeight,initialWidth 161 225  
leftX,leftY 26 139  
initialHeight,initialWidth 163 228  
leftX,leftY 0 147  
initialHeight,initialWidth 137 192  
leftX,leftY 0 148  
initialHeight,initialWidth 147 206  
leftX,leftY 0 153

initialHeight,initialWidth 136 190  
leftX,leftY 0 160  
initialHeight,initialWidth 136 190  
leftX,leftY 25 176  
initialHeight,initialWidth 146 204  
leftX,leftY 28 193  
initialHeight,initialWidth 137 192  
leftX,leftY 1 196  
initialHeight,initialWidth 141 197  
leftX,leftY 0 176  
initialHeight,initialWidth 155 217  
leftX,leftY 0 158  
initialHeight,initialWidth 162 227  
leftX,leftY 0 136  
initialHeight,initialWidth 158 221  
leftX,leftY 0 120  
initialHeight,initialWidth 158 221  
leftX,leftY 0 114  
initialHeight,initialWidth 162 227  
leftX,leftY 0 120  
initialHeight,initialWidth 168 235  
leftX,leftY 0 122  
initialHeight,initialWidth 167 234  
leftX,leftY 0 111  
initialHeight,initialWidth 177 248  
leftX,leftY 0 107  
initialHeight,initialWidth 177 248  
leftX,leftY 18 91  
initialHeight,initialWidth 178 249  
leftX,leftY 40 64  
initialHeight,initialWidth 198 277  
leftX,leftY 57 64  
initialHeight,initialWidth 210 294  
leftX,leftY 65 65  
initialHeight,initialWidth 203 284  
leftX,leftY 89 72  
initialHeight,initialWidth 204 286  
leftX,leftY 114 73  
initialHeight,initialWidth 201 281  
leftX,leftY 115 74  
initialHeight,initialWidth 206 288  
leftX,leftY 220 69  
initialHeight,initialWidth 218 305  
leftX,leftY 214 58  
initialHeight,initialWidth 232 325  
leftX,leftY 210 53  
initialHeight,initialWidth 234 328  
leftX,leftY 200 53

initialHeight,initialWidth 232 325  
 leftX,leftY 222 55  
 initialHeight,initialWidth 228 319  
 leftX,leftY 241 56  
 initialHeight,initialWidth 221 309  
 leftX,leftY 243 56  
 initialHeight,initialWidth 225 315  
 leftX,leftY 241 69  
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 leftX,leftY 229 91  
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 leftX,leftY 218 93  
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 initialHeight,initialWidth 148 207  
 leftX,leftY 220 72  
 initialHeight,initialWidth 145 203  
 leftX,leftY 214 57  
 initialHeight,initialWidth 150 210  
 leftX,leftY 215 59  
 initialHeight,initialWidth 144 202  
 leftX,leftY 219 56  
 initialHeight,initialWidth 144 202  
 leftX,leftY 197 60  
 initialHeight,initialWidth 150 210  
 leftX,leftY 195 62



```
initialHeight,initialWidth 138 193  
leftX,leftY 181 61  
initialHeight,initialWidth 145 203  
leftX,leftY 171 61  
initialHeight,initialWidth 148 207  
leftX,leftY 175 70  
initialHeight,initialWidth 140 196  
leftX,leftY 181 69  
initialHeight,initialWidth 134 188  
leftX,leftY 190 66  
initialHeight,initialWidth 137 192
```

