CV Reference Manual

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Image Processing

Note:

The chapter describes functions for image processing and analysis. Most of the functions work with 2d arrays of pixels. We refer the arrays as "images" however they do not necessarily have to be IplImage's, they may be CvMat's or CvMatND's as well.

Gradients, Edges and Corners

Sobel

Calculates first, second, third or mixed image derivatives using extended Sobel operator

```
void cvSobel( const CvArr* src, CvArr* dst, int xorder, int yorder, int aperture_size=3 );
src
    Source image.
dst
    Destination image.
xorder
    Order of the derivative x .
yorder
    Order of the derivative y .
aperture_size
    Size of the extended Scholkernel must be 1 3 5 or 7. In all cases except 1 aperture_size xenerable kernel will be
```

Size of the extended Sobel kernel, must be 1, 3, 5 or 7. In all cases except 1, aperture_size ×aperture_size separable kernel will be used to calculate the derivative. For aperture_size=1 3x1 or 1x3 kernel is used (Gaussian smoothing is not done). There is also special value CV_SCHARR (=-1) that corresponds to 3x3 Scharr filter that may give more accurate results than 3x3 Sobel. Scharr aperture is:

```
| -3 0 3
|-10 0 10
| -3 0 3
```

for x-derivative or transposed for y-derivative.

The function cvSobel calculates the image derivative by convolving the image with the appropriate kernel:

```
dst(x,y) = d^{xorder+yoder}src/dx^{xorder} \cdot dy^{yorder} \mid_{(x,y)}
```

The Sobel operators combine Gaussian smoothing and differentiation so the result is more or less robust to the noise. Most often, the function is called with (xorder=1, yorder=0, aperture_size=3) or (xorder=0, yorder=1, aperture_size=3) to calculate first x- or y- image derivative. The first case corresponds to

$$\begin{vmatrix} -1 & 0 & 1 \\ -2 & 0 & 2 \\ -1 & 0 & 1 \end{vmatrix}$$

kernel and the second one corresponds to

$$\begin{vmatrix}
-1 & -2 & -1 \\
0 & 0 & 0 \\
1 & 2 & 1
\end{vmatrix}$$
or
$$\begin{vmatrix}
1 & 2 & 1 \\
0 & 0 & 0 \\
-1 & -2 & -1
\end{vmatrix}$$

kernel, depending on the image origin (origin field of IplImage structure). No scaling is done, so the destination image usually has larger by absolute value numbers than the source image. To avoid overflow, the function requires 16-bit destination image if the source image is 8-bit. The result can be converted back to 8-bit using cvConvertScale or cvConvertScaleAbs functions. Besides 8-bit images the function can process 32-bit floating-point images. Both source and destination must be single-channel images of equal size or ROI size.

Laplace

Calculates Laplacian of the image

```
void cvLaplace( const CvArr* src, CvArr* dst, int aperture_size=3 );
```

src

Source image.

dst

Destination image.

aperture_size

Aperture size (it has the same meaning as in <u>cvSobel</u>).

The function cvLaplace calculates Laplacian of the source image by summing second x- and y- derivatives calculated using Sobel operator:

$$dst(x,y) = d^2src/dx^2 + d^2src/dy^2$$

Specifying aperture_size=1 gives the fastest variant that is equal to convolving the image with the following kernel:

Similar to <u>cvSobel</u> function, no scaling is done and the same combinations of input and output formats are supported.

Canny

Implements Canny algorithm for edge detection

The function cvCanny finds the edges on the input image image and marks them in the output image edges using the Canny algorithm. The smallest of threshold1 and threshold2 is used for edge linking, the largest - to find initial segments of strong edges.

PreCornerDetect

Calculates feature map for corner detection

The function cvPreCornerDetect calculates the function $D_x{}^2D_{yy} + D_y{}^2D_{xx} - 2D_xD_yD_{xy}$ where D_2 denotes one of the first image derivatives and D_{22} denotes a second image derivative. The corners can be found as local maximums of the function:

```
// assume that the image is floating-point
IplImage* corners = cvCloneImage(image);
IplImage* dilated_corners = cvCloneImage(image);
IplImage* corner_mask = cvCreateImage( cvGetSize(image), 8, 1 );
cvPreCornerDetect( image, corners, 3 );
cvDilate( corners, dilated_corners, 0, 1 );
cvSubS( corners, dilated_corners, corners );
cvCmpS( corners, 0, corner_mask, CV_CMP_GE );
cvReleaseImage( &corners );
cvReleaseImage( &dilated_corners );
```

CornerEigenValsAndVecs

Calculates eigenvalues and eigenvectors of image blocks for corner detection

```
void cvCornerEigenValsAndVecs( const CvArr* image, CvArr* eigenvv,
```

```
int block_size, int aperture_size=3 );
```

image

Input image.

eigenvv

Image to store the results. It must be 6 times wider than the input image.

block size

Neighborhood size (see discussion).

aperture_size

Aperture parameter for Sobel operator (see cvSobel).

For every pixel The function cvCornerEigenValsAndVecs considers $block_size \times block_size$ neigborhood S(p). It calcualtes covariation matrix of derivatives over the neigborhood as:

After that it finds eigenvectors and eigenvalues of the matrix and stores them into destination image in form $(\lambda_1, \lambda_2, x_1, y_1, x_2, y_2)$, where

 λ_1, λ_2 - eigenvalues of M; not sorted

 (x_1, y_1) - eigenvector corresponding to λ_1

 (x_2, y_2) - eigenvector corresponding to λ_2

CornerMinEigenVal

Calculates minimal eigenvalue of gradient matrices for corner detection

```
void cvCornerMinEigenVal( const CvArr* image, CvArr* eigenval, int block_size, int
aperture_size=3 );
```

image

Input image.

eigenval

Image to store the minimal eigen values. Should have the same size as image

block size

Neighborhood size (see discussion of cvCornerEigenValsAndVecs).

aperture_size

Aperture parameter for Sobel operator (see <u>cvSobel</u>). format. In the case of floating-point input format this parameter is the number of the fixed float filter used for differencing.

The function cvCornerMinEigenVal is similar to cvCornerEigenValsAndVecs but it calculates and stores only the minimal eigen value of derivative covariation matrix for every pixel, i.e. $min(\lambda_1, \lambda_2)$ in terms of the previous function.

CornerHarris

Harris edge detector

Neighborhood size (see discussion of cvCornerEigenValsAndVecs).

aperture_size

Aperture parameter for Sobel operator (see <u>cvSobel</u>). format. In the case of floating-point input format this parameter is the number of the fixed float filter used for differencing.

k

Harris detector free parameter. See the formula below.

The function cvCornerHarris runs the Harris edge detector on image. Similarly to cvCornerMinEigenVal and cvCornerEigenValsAndVecs, for each pixel it calculates 2x2 gradient covariation matrix M over block_sizexblock_size neighborhood. Then, it stores

```
det(M) - k*trace(M)^2
```

to the destination image. Corners in the image can be found as local maxima of the destination image.

FindCornerSubPix

Refines corner locations

image

Input image.

corners

Initial coordinates of the input corners and refined coordinates on output.

count

Number of corners.

win

Half sizes of the search window. For example, if win=(5,5) then $5*2+1 \times 5*2+1 = 11 \times 11$ search window is used.

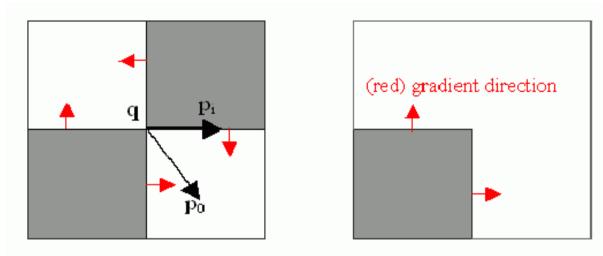
zero_zone

Half size of the dead region in the middle of the search zone over which the summation in formulae below is not done. It is used sometimes to avoid possible singularities of the autocorrelation matrix. The value of (-1,-1) indicates that there is no such size.

criteria

Criteria for termination of the iterative process of corner refinement. That is, the process of corner position refinement stops either after certain number of iteration or when a required accuracy is achieved. The criteria may specify either of or both the maximum number of iteration and the required accuracy.

The function cvFindCornerSubPix iterates to find the sub-pixel accurate location of corners, or radial saddle points, as shown in on the picture below.



Sub-pixel accurate corner locator is based on the observation that every vector from the center q to a point p located within a neighborhood of q is orthogonal to the image gradient at p subject to image and measurement noise. Consider the expression:

$$\varepsilon_{i}$$
=DI_{p;}^T• (q-p_i)

where DI_{p_i} is the image gradient at the one of the points p_i in a neighborhood of q. The value of q is to be found such that ϵ_i is minimized. A system of equations may be set up with ϵ_i ' set to zero:

$$sum_{i}(DI_{p_{i}} \bullet DI_{p_{i}}^{T}) \bullet q - sum_{i}(DI_{p_{i}} \bullet DI_{p_{i}}^{T} \bullet p_{i}) = 0$$

where the gradients are summed within a neighborhood ("search window") of q. Calling the first gradient term G and the second gradient term b gives:

$$q=G^{-1} \cdot b$$

The algorithm sets the center of the neighborhood window at this new center q and then iterates until the center keeps within a set threshold.

GoodFeaturesToTrack

Determines strong corners on image

```
void cvGoodFeaturesToTrack( const CvArr* image, CvArr* eig image, CvArr* temp image,
                                   CvPoint2D32f* corners, int* corner count,
                                   double quality level, double min distance,
                                   const CvArr* mask=NULL, int block size=3,
                                   int use harris=0, double k=0.04);
image
      The source 8-bit or floating-point 32-bit, single-channel image.
eig_image
      Temporary floating-point 32-bit image of the same size as image.
temp image
      Another temporary image of the same size and same format as eig image.
corners
      Output parameter. Detected corners.
corner_count
      Output parameter. Number of detected corners.
quality_level
      Multiplier for the maxmin eigenvalue; specifies minimal accepted quality of image corners.
min distance
      Limit, specifying minimum possible distance between returned corners; Euclidian distance is used.
```

Limit, specifying minimum possible distance between returned corners; Euclidian distance is used

Region of interest. The function selects points either in the specified region or in the whole image if the mask is NULL. block_size

Size of the averaging block, passed to underlying <u>cvCornerMinEigenVal</u> or <u>cvCornerHarris</u> used by the function. use_harris

If nonzero, Harris operator (<u>cvCornerHarris</u>) is used instead of default <u>cvCornerMinEigenVal</u>.

Free parameter of Harris detector; used only if use_harris≠0

The function cvGoodFeaturesToTrack finds corners with big eigenvalues in the image. The function first calculates the minimal eigenvalue for every source image pixel using cvCornerMinEigenVal function and stores them in eig_image. Then it performs non-maxima suppression (only local maxima in 3x3 neighborhood remain). The next step is rejecting the corners with the minimal eigenvalue less than quality_level•max(eig_image(x,y)). Finally, the function ensures that all the corners found are distanced enough one from another by considering the corners (the most strongest corners are considered first) and checking that the distance between the newly considered feature and the features considered earlier is larger than min_distance. So, the function removes the features than are too close to the stronger features.

k

Sampling, Interpolation and Geometrical Transforms

SampleLine

Reads raster line to buffer

The function cvSampleLine implements a particular case of application of line iterators. The function reads all the image points lying on the line between pt1 and pt2, including the ending points, and stores them into the buffer.

GetRectSubPix

Retrieves pixel rectangle from image with sub-pixel accuracy

```
void cvGetRectSubPix( const CvArr* src, CvArr* dst, CvPoint2D32f center );

src
    Source image.
dst
    Extracted rectangle.
center
```

Floating point coordinates of the extracted rectangle center within the source image. The center must be inside the image.

The function cvGetRectSubPix extracts pixels from src:

```
dst(x, y) = src(x + center.x - (width(dst)-1)*0.5, y + center.y - (height(dst)-1)*0.5)
```

where the values of pixels at non-integer coordinates are retrieved using bilinear interpolation. Every channel of multiple-channel images is processed independently. Whereas the rectangle center must be inside the image, the whole rectangle may be partially occluded. In this case, the replication border mode is used to get pixel values beyond the image boundaries.

GetQuadrangleSubPix

Retrieves pixel quadrangle from image with sub-pixel accuracy

```
void cvGetQuadrangleSubPix( const CvArr* src, CvArr* dst, const CvMat* map_matrix );
src
    Source image.
dst
    Extracted quadrangle.
map_matrix
    The transformation 2 × 3 matrix [A|b] (see the discussion).
```

The function cvGetQuadrangleSubPix extracts pixels from src at sub-pixel accuracy and stores them to dst as follows:

where the values of pixels at non-integer coordinates $A \bullet (x,y)^T + b$ are retrieved using bilinear interpolation. When the function needs pixels

outside of the image, it uses replication border mode to reconstruct the values. Every channel of multiple-channel images is processed independently.

Resize

Resizes image

```
void cvResize( const CvArr* src, CvArr* dst, int interpolation=CV_INTER_LINEAR );
src
    Source image.
dst
    Destination image.
interpolation
    Interpolation method:
```

- CV_INTER_NN nearest-neighbor interpolation,
 - o CV_INTER_LINEAR bilinear interpolation (used by default)
 - o CV_INTER_AREA resampling using pixel area relation. It is preferred method for image decimation that gives moire-free results. In case of zooming it is similar to CV_INTER_NN method.
 - o CV_INTER_CUBIC bicubic interpolation.

The function cyResize resizes image src so that it fits exactly to dst. If ROI is set, the function consideres the ROI as supported as usual.

WarpAffine

Applies affine transformation to the image

2×3 transformation matrix.

flags

A combination of interpolation method and the following optional flags:

- CV_WARP_FILL_OUTLIERS fill all the destination image pixels. If some of them correspond to outliers in the source image, they are set to fillval.
- o CV_WARP_INVERSE_MAP indicates that matrix is inverse transform from destination image to source and, thus, can be used directly for pixel interpolation. Otherwise, the function finds the inverse transform from map_matrix.

fillval

A value used to fill outliers.

The function cvWarpAffine transforms source image using the specified matrix:

```
dst(x',y') < -src(x,y)

(x',y')^T = map_matrix \cdot (x,y,1)^T + b if CV_WARP_INVERSE_MAP is not set,

(x,y)^T = map_matrix \cdot (x',y\&apos,1)^T + b otherwise
```

The function is similar to cvGetQuadrangleSubPix but they are not exactly the same. cvWarpAffine requires input and output image have the same data type, has larger overhead (so it is not quite suitable for small images) and can leave part of destination image unchanged. While cvGetQuadrangleSubPix may extract quadrangles from 8-bit images into floating-point buffer, has smaller overhead and always changes the whole destination image content.

To transform a sparse set of points, use <u>cvTransform</u> function from cxcore.

2DRotationMatrix

Calculates affine matrix of 2d rotation

Pointer to the destination 2×3 matrix.

The function cv2DRotationMatrix calculates matrix:

```
[ \alpha \beta | (1-\alpha)*center.x - \beta*center.y ] 
 [ -\beta \alpha | \beta*center.x + (1-\alpha)*center.y ] 
 where \alpha=scale*cos(angle), \beta=scale*sin(angle)
```

The transformation maps the rotation center to itself. If this is not the purpose, the shift should be adjusted.

WarpPerspective

Applies perspective transformation to the image

A combination of interpolation method and the following optional flags:

- o CV_WARP_FILL_OUTLIERS fill all the destination image pixels. If some of them correspond to outliers in the source image, they are set to fillval.
- o CV_WARP_INVERSE_MAP indicates that matrix is inverse transform from destination image to source and, thus, can be used directly for pixel interpolation. Otherwise, the function finds the inverse transform from map_matrix.

fillval

A value used to fill outliers.

The function cvWarpPerspective transforms source image using the specified matrix:

```
dst(x',y') < -src(x,y)
```

```
(t \cdot x', t \cdot y', t)^T = map_matrix \cdot (x, y, 1)^T + b if CV_WARP_INVERSE_MAP is not set, (t \cdot x, t \cdot y, t)^T = map_matrix \cdot (x', y \cdot apos, 1)^T + b otherwise
```

For a sparse set of points use cvPerspectiveTransform function from cxcore.

WarpPerspectiveQMatrix

Calculates perspective transform from 4 corresponding points

Pointer to the destination 3×3 matrix.

The function cvWarpPerspectiveQMatrix calculates matrix of perspective transform such that:

```
(t_i \cdot x_i, t_i \cdot y_i, t_i)^T = map_matrix \cdot (x_i, y_i, 1)^T
where dst(i) = (x_i, y_i), src(i) = (x_i, y_i), i = 0...3.
```

Remap

Applies generic geometrical transformation to the image

```
Source image.

dst

Destination image.

mapx

The map of x-coordinates (32fC1 image).

mapy

The map of y-coordinates (32fC1 image).

flags

A combination of interpolation method and the following optional flag(s):

CV_WARP_FILL_OUTLIERS - fill all the destination image pixels. If some of them correspond to outliers in the source image, they are set to fillval.
```

A value used to fill outliers.

The function cvRemap transforms source image using the specified map:

```
dst(x,y) < -src(mapx(x,y), mapy(x,y))
```

Similar to other geometrical transformations, some interpolation method (specified by user) is used to extract pixels with non-integer coordinates.

LogPolar

fillval

Remaps image to log-polar space

flags

A combination of interpolation method and the following optional flags:

- CV_WARP_FILL_OUTLIERS fill all the destination image pixels. If some of them correspond to outliers in the source image, they are set to zeros.
- o CV_WARP_INVERSE_MAP indicates that matrix is inverse transform from destination image to source and, thus, can be used directly for pixel interpolation. Otherwise, the function finds the inverse transform from map_matrix.

fillval

A value used to fill outliers.

The function cvLogPolar transforms source image using the following transformation:

The function emulates the human "foveal" vision and can be used for fast scale and rotation-invariant template matching, for object tracking etc.

Example. Log-polar transformation.

```
#include <cv.h>
#include <highgui.h>

int main(int argc, char** argv)
{
    IplImage* src;

    if( argc == 2 && (src=cvLoadImage(argv[1],1) != 0 )
    {
        IplImage* dst = cvCreateImage( cvSize(256,256), 8, 3 );
        IplImage* src2 = cvCreateImage( cvGetSize(src), 8, 3 );
        cvLogPolar( src, dst, cvPoint2D32f(src->width/2,src->height/2), 40, CV_INTER_LINEAR
+CV_WARP_FILL_OUTLIERS );
```

And this is what the program displays when opency/samples/c/fruits.jpg is passed to it



Morphological Operations

CreateStructuringElementEx

Creates structuring element

cols

Number of columns in the structuring element.

rows

Number of rows in the structuring element.

anchor_x

Relative horizontal offset of the anchor point.

anchor_y

Relative vertical offset of the anchor point.

shape

Shape of the structuring element; may have the following values:

- o CV_SHAPE_RECT, a rectangular element;
- o CV_SHAPE_CROSS, a cross-shaped element;
- o CV_SHAPE_ELLIPSE, an elliptic element;
- o CV_SHAPE_CUSTOM, a user-defined element. In this case the parameter values specifies the mask, that is, which neighbors of the pixel must be considered.

values

Pointer to the structuring element data, a plane array, representing row-by-row scanning of the element matrix. Non-zero values indicate points that belong to the element. If the pointer is NULL, then all values are considered non-zero, that is, the element is of a rectangular shape. This parameter is considered only if the shape is CV_SHAPE_CUSTOM.

The function <u>cv CreateStructuringElementEx</u> allocates and fills the structure IplConvKernel, which can be used as a structuring element in the morphological operations.

ReleaseStructuringElement

Deletes structuring element

```
void cvReleaseStructuringElement( IplConvKernel** element );
element
```

Pointer to the deleted structuring element.

The function cvReleaseStructuringElement releases the structure IplConvKernel that is no longer needed. If *element is NULL, the function has no effect.

Erode

Erodes image by using arbitrary structuring element

Number of times erosion is applied.

The function cvErode erodes the source image using the specified structuring element that determines the shape of a pixel neighborhood over which the minimum is taken:

```
dst=erode(src,element): dst(x,y)=min_{((x',v') in element)})src(x+x',y+y')
```

The function supports the in-place mode. Erosion can be applied several (iterations) times. In case of color image each channel is processed independently.

Dilate

Dilates image by using arbitrary structuring element

```
void cvDilate( const CvArr* src, CvArr* dst, IplConvKernel* element=NULL, int iterations=1 );
src
    Source image.
dst
    Destination image.
element
    Structuring element used for erosion. If it is NULL, a 3×3 rectangular structuring element is used.
```

iterations

Number of times erosion is applied.

The function cvDilate dilates the source image using the specified structuring element that determines the shape of a pixel neighborhood over which the maximum is taken:

```
dst=dilate(src,element): dst(x,y)=max_{((x',y') in element)})src(x+x',y+y')
```

The function supports the in-place mode. Dilation can be applied several (iterations) times. In case of color image each channel is processed independently.

MorphologyEx

Performs advanced morphological transformations

```
void cvMorphologyEx( const CvArr* src, CvArr* dst, CvArr* temp,
                          IplConvKernel* element, int operation, int iterations=1 );
src
     Source image.
dst
     Destination image.
temp
     Temporary image, required in some cases.
element
     Structuring element.
operation
     Type of morphological operation, one of:
     CV MOP OPEN - opening
     CV MOP CLOSE - closing
     CV_MOP_GRADIENT - morphological gradient
     CV MOP TOPHAT - "top hat"
     CV MOP_BLACKHAT - "black hat"
iterations
```

Number of times erosion and dilation are applied.

The function cvMorphologyEx can perform advanced morphological transformations using erosion and dilation as basic operations.

```
Opening:
dst=open(src,element)=dilate(erode(src,element),element)

Closing:
dst=close(src,element)=erode(dilate(src,element),element)

Morphological gradient:
dst=morph_grad(src,element)=dilate(src,element)-erode(src,element)

"Top hat":
dst=tophat(src,element)=src-open(src,element)

"Black hat":
dst=blackhat(src,element)=close(src,element)-src
```

The temporary image temp is required for morphological gradient and, in case of in-place operation, for "top hat" and "black hat".

Filters and Color Conversion

Smooth

Smooths the image in one of several ways

neighborhood size may vary, one may precompute integral image with <u>cvIntegral</u> function.

- o CV_BLUR (simple blur) summation over a pixel param1×param2 neighborhood with subsequent scaling by 1/ (param1•param2).
- o CV_GAUSSIAN (gaussian blur) convolving image with param1×param2 Gaussian kernel.
- o CV_MEDIAN (median blur) finding median of param1×param1 neighborhood (i.e. the neighborhood is square).
- CV_BILATERAL (bilateral filter) applying bilateral 3x3 filtering with color sigma=param1 and space sigma=param2.
 Information about bilateral filtering can be found at http://www.dai.ed.ac.uk/CVonline/LOCAL_COPIES/MANDUCHI1/Bilateral_Filtering.html

param1

The first parameter of smoothing operation.

param2

The second parameter of smoothing operation. In case of simple scaled/non-scaled and Gaussian blur if param2 is zero, it is set to param1.

param3

In case of Gaussian parameter this parameter may specify Gaussian sigma (standard deviation). If it is zero, it is calculated from the kernel size:

```
sigma = (n/2 - 1)*0.3 + 0.8, where n=param1 for horizontal kernel, n=param2 for vertical kernel.
```

Using standard sigma for small kernels (3×3 to 7×7) gives better speed. If param3 is not zero, while param1 and param2 are zeros, the kernel size is calculated from the sigma (to provide accurate enough operation).

The function cvSmooth smooths image using one of several methods. Every of the methods has some features and restrictions listed below

Blur with no scaling works with single-channel images only and supports accumulation of 8-bit to 16-bit format (similar to <u>cvSobel</u> and <u>cvLaplace</u>) and 32-bit floating point to 32-bit floating-point format.

Simple blur and Gaussian blur support 1- or 3-channel, 8-bit and 32-bit floating point images. These two methods can process images in-place.

Median and bilateral filters work with 1- or 3-channel 8-bit images and can not process images in-place.

Filter2D

Convolves image with the kernel

```
void cvFilter2D( const CvArr* src, CvArr* dst,
                  const CvMat* kernel.
                  CvPoint anchor=cvPoint(-1,-1));
src
     The source image.
dst
```

The destination image.

kernel

Convolution kernel, single-channel floating point matrix. If you want to apply different kernels to different channels, split the image using cvSplit into separate color planes and process them individually.

anchor

The anchor of the kernel that indicates the relative position of a filtered point within the kernel. The anchor should lie within the kernel. The special default value (-1,-1) means that it is at the kernel center.

The function cvFilter2D applies arbitrary linear filter to the image. In-place operation is supported. When the aperture is partially outside the image, the function interpolates outlier pixel values from the nearest pixels that is inside the image.

CopyMakeBorder

Copies image and makes border around it

```
void cvCopyMakeBorder( const CvArr* src, CvArr* dst, CvPoint offset,
                         int bordertype, CvScalar value=cvScalarAll(0) );
src
     The source image.
dst
     The destination image.
```

Coordinates of the top-left corner (or bottom-left in case of images with bottom-left origin) of the destination image rectangle where the source image (or its ROI) is copied. Size of the rectanlge matches the source image size/ROI size.

bordertype

offset

Type of the border to create around the copied source image rectangle:

IPL BORDER CONSTANT - border is filled with the fixed value, passed as last parameter of the function.

IPL_BORDER_REPLICATE - the pixels from the top and bottom rows, the left-most and right-most columns are replicated to fill the border.

(The other two border types from IPL, IPL BORDER REFLECT and IPL BORDER WRAP, are currently unsupported).

value

Value of the border pixels if bordertype=IPL_BORDER_CONSTANT.

The function cvCopyMakeBorder copies the source 2D array into interior of destination array and makes a border of the specified type around the copied area. The function is useful when one needs to emulate border type that is different from the one embedded into a specific algorithm implementation. For example, morphological functions, as well as most of other filtering functions in OpenCV, internally use replication border type, while the user may need zero border or a border, filled with 1's or 255's.

Integral

Calculates integral images

The function cvIntegral calculates one or more integral images for the source image as following:

```
\begin{aligned} & \text{sum}(\textbf{X},\textbf{Y}) = \text{sum}_{\textbf{x} < \textbf{X}, \textbf{y} < \textbf{Y}} \text{image}(\textbf{x},\textbf{y}) \\ & \text{sqsum}(\textbf{X},\textbf{Y}) = \text{sum}_{\textbf{x} < \textbf{X}, \textbf{y} < \textbf{Y}} \text{image}(\textbf{x},\textbf{y})^2 \\ & \text{tilted\_sum}(\textbf{X},\textbf{Y}) = \text{sum}_{\textbf{y} < \textbf{Y}, \text{abs}(\textbf{x} - \textbf{X}) < \textbf{y}} \text{image}(\textbf{x},\textbf{y}) \end{aligned}
```

Using these integral images, one may calculate sum, mean, standard deviation over arbitrary up-right or rotated rectangular region of the image in a constant time, for example:

```
sum_{x1 < x < x2, y1 < y < y2}image(x,y) = sum(x2,y2) - sum(x1,y2) - sum(x2,y1) + sum(x1,x1)
```

It makes possible to do a fast blurring or fast block correlation with variable window size etc. In case of multi-channel images sums for each channel are accumulated independently.

CvtColor

Converts image from one color space to another

```
void cvCvtColor( const CvArr* src, CvArr* dst, int code );

src
    The source 8-bit (8u), 16-bit (16u) or single-precision floating-point (32f) image.

dst
    The destination image of the same data type as the source one. The number of channels may be different.

code
    Color conversion operation that can be specifed using CV_<src_color_space>2<dst_color_space> constants (see below).
```

The function cvCvtColor converts input image from one color space to another. The function ignores colorModel and channelSeq fields of IplImage header, so the source image color space should be specified correctly (including order of the channels in case of RGB space, e.g. BGR means 24-bit format with $B_0 G_0 R_0 B_1 G_1 R_1$... layout, whereas RGB means 24-format with $R_0 G_0 B_0 R_1 G_1 B_1$... layout).

The conventional range for R,G,B channel values is:

- 0..255 for 8-bit images
- 0..65535 for 16-bit images and
- 0..1 for floating-point images.

Of course, in case of linear transformations the range can be arbitrary, but in order to get correct results in case of non-linear transformations, the input image should be scaled if necessary.

The function can do the following transformations:

• Transformations within RGB space like adding/removing alpha channel, reversing the channel order, conversion to/from 16-bit RGB color (R5:G6:B5 or R5:G5:B5) color, as well as conversion to/from grayscale using:

```
RGB[A]->Gray: Y<-0.299*R + 0.587*G + 0.114*B Gray->RGB[A]: R<-Y G<-Y B<-Y A<-0
```

• RGB<=>CIE XYZ.Rec 709 with D65 white point (CV_BGR2XYZ, CV_RGB2XYZ, CV_XYZ2BGR, CV_XYZ2RGB):

X, Y and Z cover the whole value range (in case of floating-point images Z may exceed 1).

• RGB<=>YCrCb JPEG (a.k.a. YCC) (CV_BGR2YCrCb, CV_RGB2YCrCb, CV_YCrCb2BGR, CV_YCrCb2RGB)

```
Y <- 0.299*R + 0.587*G + 0.114*B
Cr <- (R-Y)*0.713 + delta
Cb <- (B-Y)*0.564 + delta

R <- Y + 1.403*(Cr - delta)
G <- Y - 0.344*(Cr - delta) - 0.714*(Cb - delta)
B <- Y + 1.773*(Cb - delta),

{ 128 for 8-bit images,
where delta = { 32768 for 16-bit images}
{ 0.5 for floating-point images</pre>
```

Y, Cr and Cb cover the whole value range.

• RGB<=>HSV (CV_BGR2HSV, CV_RGB2HSV, CV_HSV2BGR, CV_HSV2RGB)

```
// In case of 8-bit and 16-bit images 
// R, G and B are converted to floating-point format and scaled to fit 0..1 range 
V \leftarrow \max(R,G,B)
S \leftarrow (V-\min(R,G,B))/V if V\neq 0, 0 otherwise 
(G-B)*60/S, if V=R
```

• RGB<=>HLS(CV_BGR2HLS, CV_RGB2HLS, CV_HLS2BGR, CV_HLS2RGB)

```
// R, G and B are converted to floating-point format and scaled to fit 0..1 range V_{max} <- \max(R,G,B) V_{min} <- \min(R,G,B) L <- (V_{max} + V_{min})/2 S <- (V_{max} - V_{min})/(V_{max} + V_{min}) if L < 0.5 (V_{max} - V_{min})/(2 - (V_{max} + V_{min})) if L \ge 0.5 (G - B)*60/S, if V_{max}=R H <- 180+(B - R)*60/S, if V_{max}=B
```

// In case of 8-bit and 16-bit images

if H<0 then H<-H+360

On output $0 \le L \le 1$, $0 \le S \le 1$, $0 \le H \le 360$.

The values are then converted to the destination data type:

```
8-bit images:
         L \leftarrow L*255, S \leftarrow S*255, H \leftarrow H/2
     16-bit images (currently not supported):
         L <- L*65535, S <- S*65535, H <- H
     32-bit images:
         H. L. S are left as is
• RGB<=>CIE L*a*b* (CV BGR2Lab, CV RGB2Lab, CV Lab2BGR, CV Lab2RGB)
 // In case of 8-bit and 16-bit images
 // R, G and B are converted to floating-point format and scaled to fit 0..1 range
 // convert R,G,B to CIE XYZ
         |X|
  ΙZΙ
 X \leftarrow X/Xn, where Xn = 0.950456
 Z \leftarrow Z/Zn, where Zn = 1.088754
 L < -116*Y^{1/3} for Y>0.008856
 L \leftarrow 903.3*Y for Y <= 0.008856
 a < -500*(f(X)-f(Y)) + delta
 b < -200*(f(Y)-f(Z)) + delta
 where f(t)=t^{1/3} for t>0.008856
       f(t)=7.787*t+16/116 for t<=0.008856
 where delta = 128 for 8-bit images,
               0 for floating-point images
 On output 0 \le L \le 100, -127 \le a \le 127, -127 \le b \le 127
 The values are then converted to the destination data type:
     8-bit images:
         L \leftarrow L*255/100, a \leftarrow a + 128, b \leftarrow b + 128
     16-bit images are currently not supported
     32-bit images:
```

L, a, b are left as is

• RGB<=>CIE L*u*v* (CV BGR2Luv, CV RGB2Luv, CV Luv2BGR, CV Luv2RGB) // In case of 8-bit and 16-bit images // R, G and B are converted to floating-point format and scaled to fit 0..1 range // convert R,G,B to CIE XYZ | X | |0.412453 0.357580 0.180423| |R| |Y| <- |0.212671 0.715160 0.072169|*|G| |z||0.019334 0.119193 0.950227| |B| $L < -116*Y^{1/3}$ for Y > 0.008856 $L \leftarrow 903.3*Y$ for Y < = 0.008856u' < -4*X/(X + 15*Y + 3*Z)v' < -9*Y/(X + 15*Y + 3*Z) $u \leftarrow 13*L*(u' - u_n)$, where $u_n=0.19793943$ $v < -13*L*(v' - v_n)$, where $v_n = 0.46831096$ On output $0 \le L \le 100$, $-134 \le u \le 220$, $-140 \le v \le 122$ The values are then converted to the destination data type: 8-bit images: $L \leftarrow L^{255/100}$, $u \leftarrow (u + 134)^{255/354}$, $v \leftarrow (v + 140)^{255/256}$ 16-bit images are currently not supported 32-bit images: L, u, v are left as is

The above formulae for converting RGB to/from various color spaces have been taken from multiple sources on Web, primarily from Color Space Conversions ([Ford98]) document at Charles Poynton site.

Bayer=>RGB (CV_BayerBG2BGR, CV_BayerGB2BGR, CV_BayerRG2BGR, CV_BayerGR2BGR, CV BayerBG2RGB, CV BayerGB2RGB, CV BayerGR2RGB)

Bayer pattern is widely used in CCD and CMOS cameras. It allows to get color picture out of a single plane where R,G and B pixels (sensors of a particular component) are interleaved like this:

R	G	R	G	R
G	В	G	В	G
R	G	R	G	R
G	В	G	В	G
R	G	R	G	R
G	В	G	В	G

The output RGB components of a pixel are interpolated from 1, 2 or 4 neighbors of the pixel having the same color. There are several modifications of the above pattern that can be achieved by shifting the pattern one pixel left and/or one pixel up. The two letters C_1 and C_2 in the conversion constants $CV_BayerC_1C_22\{BGR|RGB\}$ indicate the particular pattern type - these are components from the second row, second and third columns, respectively. For example, the above pattern has very popular "BG" type.

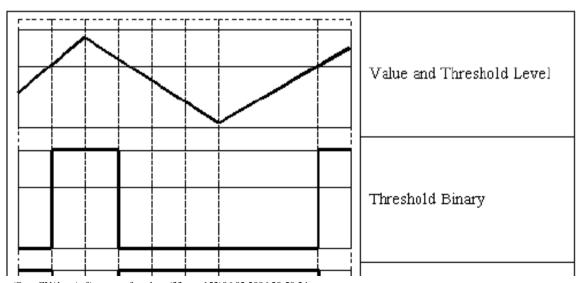
Threshold

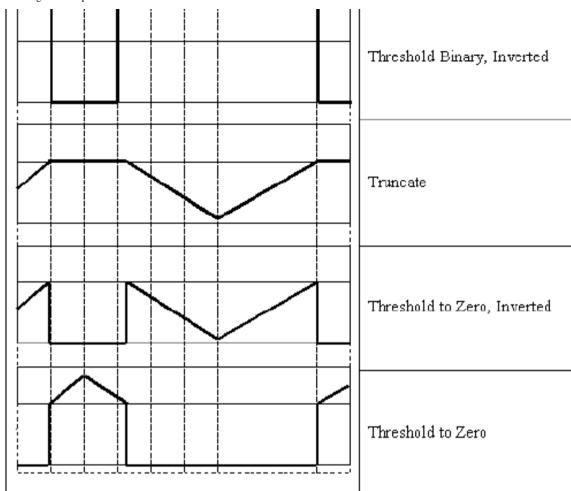
Applies fixed-level threshold to array elements

The function cvThreshold applies fixed-level thresholding to single-channel array. The function is typically used to get bi-level (binary) image out of grayscale image (cvCmpS could be also used for this purpose) or for removing a noise, i.e. filtering out pixels with too small or

too large values. There are several types of thresholding the function supports that are determined by threshold_type:

And this is the visual description of thresholding types:





AdaptiveThreshold

Applies adaptive threshold to array

src

Source image.

dst

Destination image.

max_value

Maximum value that is used with CV_THRESH_BINARY and CV_THRESH_BINARY_INV.

adaptive_method

Adaptive thresholding algorithm to use: CV_ADAPTIVE_THRESH_MEAN_C or CV_ADAPTIVE_THRESH_GAUSSIAN_C (see the discussion).

threshold_type

Thresholding type; must be one of

- o CV THRESH BINARY,
- o CV THRESH BINARY INV

block size

The size of a pixel neighborhood that is used to calculate a threshold value for the pixel: 3, 5, 7, ... paraml

The method-dependent parameter. For the methods CV_ADAPTIVE_THRESH_MEAN_C and CV_ADAPTIVE_THRESH_GAUSSIAN_C it is a constant subtracted from mean or weighted mean (see the discussion), though it may be negative.

The function cvAdaptiveThreshold transforms grayscale image to binary image according to the formulae:

where T_I is a threshold calculated individually for each pixel.

For the method CV_ADAPTIVE_THRESH_MEAN_C it is a mean of block_size × block_size pixel neighborhood, subtracted by param1.

For the method CV_ADAPTIVE_THRESH_GAUSSIAN_C it is a weighted sum (gaussian) of block_size × block_size pixel neighborhood, subtracted by paraml.

Pyramids and the Applications

PyrDown

Downsamples image

```
void cvPyrDown( const CvArr* src, CvArr* dst, int filter=CV_GAUSSIAN_5x5 );
src
    The source image.
dst
    The destination image, should have 2x smaller width and height than the source.
filter
    Type of the filter used for convolution; only CV GAUSSIAN 5x5 is currently supported.
```

The function cvPyrDown performs downsampling step of Gaussian pyramid decomposition. First it convolves source image with the specified filter and then downsamples the image by rejecting even rows and columns.

PyrUp

Upsamples image

The function cvPyrUp performs up-sampling step of Gaussian pyramid decomposition. First it upsamples the source image by injecting even zero rows and columns and then convolves result with the specified filter multiplied by 4 for interpolation. So the destination image is four times larger than the source image.

PyrSegmentation

Implements image segmentation by pyramids

```
void cvPyrSegmentation( IplImage* src, IplImage* dst,
                               CvMemStorage* storage, CvSeg** comp,
                               int level, double threshold1, double threshold2 );
src
      The source image.
dst
      The destination image.
storage
      Storage; stores the resulting sequence of connected components.
comp
      Pointer to the output sequence of the segmented components.
level
      Maximum level of the pyramid for the segmentation.
threshold1
      Error threshold for establishing the links.
threshold2
      Error threshold for the segments clustering.
```

The function cvPyrSegmentation implements image segmentation by pyramids. The pyramid builds up to the level level. The links between any pixel a on level i and its candidate father pixel b on the adjacent level are established if

```
p(c(a), c(b)) < threshold1. After the connected components are defined, they are joined into several clusters. Any two segments A and B belong to the same cluster, if p(c(A), c(B)) < threshold2. The input image has only one channel, then
```

```
p(c^1, c^2) = |c^1-c^2|. If the input image has three channels (red, green and blue), then
```

 $p(c^1,c^2)=0,3\cdot(c^1_r-c^2_r)+0,59\cdot(c^1_g-c^2_g)+0,11\cdot(c^1_b-c^2_b) \quad \text{. There may be more than one connected component per a cluster.}$

The images src and dst should be 8-bit single-channel or 3-channel images or equal size

Connected Components

CvConnectedComp

Connected component

```
typedef struct CvConnectedComp
{
    double area; /* area of the segmented component */
    float value; /* gray scale value of the segmented component */
    CvRect rect; /* ROI of the segmented component */
} CvConnectedComp;
```

FloodFill

Fills a connected component with given color

Maximal lower brightness/color difference between the currently observed pixel and one of its neighbor belong to the component of seed pixel to add the pixel to component. In case of 8-bit color images it is packed value.

up_diff

Maximal upper brightness/color difference between the currently observed pixel and one of its neighbor belong to the component or seed pixel to add the pixel to component. In case of 8-bit color images it is packed value.

comp

Pointer to structure the function fills with the information about the repainted domain.

flags

The operation flags. Lower bits contain connectivity value, 4 (by default) or 8, used within the function. Connectivity determines which neighbors of a pixel are considered. Upper bits can be 0 or combination of the following flags:

- o CV_FLOODFILL_FIXED_RANGE if set the difference between the current pixel and seed pixel is considered, otherwise difference between neighbor pixels is considered (the range is floating).
- o CV_FLOODFILL_MASK_ONLY if set, the function does not fill the image (new_val is ignored), but the fills mask (that must be non-NULL in this case).

mask

Operation mask, should be singe-channel 8-bit image, 2 pixels wider and 2 pixels taller than image. If not NULL, the function uses and updates the mask, so user takes responsibility of initializing mask content. Floodfilling can't go across non-zero pixels in the mask, for example, an edge detector output can be used as a mask to stop filling at edges. Or it is possible to use the same mask in multiple calls to the function to make sure the filled area do not overlap. *Note*: because mask is larger than the filled image, pixel in mask that corresponds to (x,y) pixel in image will have coordinates (x+1,y+1).

The function cvFloodFill fills a connected component starting from the seed point with the specified color. The connectivity is determined by the closeness of pixel values. The pixel at (x, y) is considered to belong to the repainted domain if:

```
src(x',y')-lo\_diff<=src(x,y)<=src(x',y')+up\_diff, grayscale image, floating range src(seed.x,seed.y)-lo<=src(x,y)<=src(seed.x,seed.y)+up\_diff, grayscale image, fixed range <math display="block">src(x',y')_r-lo\_diff_r<=src(x,y)_r<=src(x',y')_r+up\_diff_r and \\ src(x',y')_g-lo\_diff_g<=src(x,y)_g<=src(x',y')_g+up\_diff_g and \\ src(x',y')_b-lo\_diff_b<=src(x,y)_b<=src(x',y')_b+up\_diff_b, color image, floating range \\ src(seed.x,seed.y)_r-lo\_diff_r<=src(x,y)_r<=src(seed.x,seed.y)_r+up\_diff_r and \\ src(seed.x,seed.y)_g-lo\_diff_g<=src(x,y)_g<=src(seed.x,seed.y)_g+up\_diff_g and \\ src(seed.x,seed.y)_b-lo\_diff_b<=src(x,y)_b<=src(seed.x,seed.y)_b+up\_diff_b, color image, fixed range \\ src(seed.x,seed.y)_b-lo\_diff_b<=src(x,y)_b<=src(seed.x,seed.y)_b+up\_diff_b
```

where src(x', y') is value of one of pixel neighbors. That is, to be added to the connected component, a pixel's color/brightness should be close enough to:

- color/brightness of one of its neighbors that are already referred to the connected component in case of floating range
- color/brightness of the seed point in case of fixed range.

FindContours

Finds contours in binary image

image

The source 8-bit single channel image. Non-zero pixels are treated as 1's, zero pixels remain 0's - that is image treated as binary. To get such a binary image from grayscale, one may use <u>cvThreshold</u>, <u>cvAdaptiveThreshold</u> or <u>cvCanny</u>. The function modifies the source image content.

storage

mode

Container of the retrieved contours.

first_contour

Output parameter, will contain the pointer to the first outer contour.

header_size

Size of the sequence header, >=sizeof(CvChain) if method=CV_CHAIN_CODE, and >=sizeof(CvContour) otherwise.

Retrieval mode.

- o CV_RETR_EXTERNAL retrive only the extreme outer contours
- o CV_RETR_LIST retrieve all the contours and puts them in the list
- o CV_RETR_CCOMP retrieve all the contours and organizes them into two-level hierarchy: top level are external boundaries of the components, second level are boundaries of the holes
- o CV_RETR_TREE retrieve all the contours and reconstructs the full hierarchy of nested contours

method

Approximation method (for all the modes, except CV_RETR_RUNS, which uses built-in approximation).

- o CV_CHAIN_CODE output contours in the Freeman chain code. All other methods output polygons (sequences of vertices).
- o CV_CHAIN_APPROX_NONE translate all the points from the chain code into points;
- CV_CHAIN_APPROX_SIMPLE compress horizontal, vertical, and diagonal segments, that is, the function leaves only their ending points;
- o CV_CHAIN_APPROX_TC89_L1,
 - CV_CHAIN_APPROX_TC89_KCOS apply one of the flavors of Teh-Chin chain approximation algorithm.
- o CV_LINK_RUNS use completely different contour retrieval algorithm via linking of horizontal segments of 1's. Only CV_RETR_LIST retrieval mode can be used with this method.

offset

Offset, by which every contour point is shifted. This is useful if the contours are extracted from the image ROI and then they should be analyzed in the whole image context.

The function cvFindContours retrieves contours from the binary image and returns the number of retrieved contours. The pointer first_contour is filled by the function. It will contain pointer to the first most outer contour or NULL if no contours is detected (if the image is completely black). Other contours may be reached from first_contour using h_next and v_next links. The sample in

<u>cvDrawContours</u> discussion shows how to use contours for connected component detection. Contours can be also used for shape analysis and object recognition - see <u>squares</u> sample in CVPR 2001 tutorial course located at SourceForge site.

StartFindContours

Initializes contour scanning process

```
CvContourScanner cvStartFindContours( CvArr* image, CvMemStorage* storage,
                                               int header size=sizeof(CvContour),
                                               int mode=CV_RETR_LIST,
                                               int method=CV CHAIN APPROX SIMPLE,
                                               CvPoint offset=cvPoint(0,0) );
image
      The source 8-bit single channel binary image.
storage
      Container of the retrieved contours.
header size
      Size of the sequence header, >=sizeof(CvChain) if method=CV_CHAIN_CODE, and >=sizeof(CvContour) otherwise.
mode
      Retrieval mode; see cvFindContours.
method
      Approximation method. It has the same meaning as in cvFindContours, but CV_LINK_RUNS can not be used here.
offset
      ROI offset; see cvFindContours.
```

The function cvStartFindContours initializes and returns pointer to the contour scanner. The scanner is used further in cvFindNextContour to retrieve the rest of contours.

FindNextContour

Finds next contour in the image

```
CvSeq* cvFindNextContour( CvContourScanner scanner );
scanner
```

Contour scanner initialized by The function cvStartFindContours.

The function cvFindNextContour locates and retrieves the next contour in the image and returns pointer to it. The function returns NULL, if there is no more contours.

SubstituteContour

Replaces retrieved contour

Substituting contour.

The function cvSubstituteContour replaces the retrieved contour, that was returned from the preceding call of The function cvFindNextContour and stored inside the contour scanner state, with the user-specified contour. The contour is inserted into the resulting structure, list, two-level hierarchy, or tree, depending on the retrieval mode. If the parameter new_contour=NULL, the retrieved contour is not included into the resulting structure, nor all of its children that might be added to this structure later.

EndFindContours

Finishes scanning process

```
CvSeq* cvEndFindContours( CvContourScanner* scanner );
scanner
```

Pointer to the contour scanner.

The function cvEndFindContours finishes the scanning process and returns the pointer to the first contour on the highest level.

Image and Contour moments

Moments

Calculates all moments up to third order of a polygon or rasterized shape

```
void cvMoments( const CvArr* arr, CvMoments* moments, int binary=0 );

arr
    Image (1-channel or 3-channel with COI set) or polygon (CvSeq of points or a vector of points).

moments
    Pointer to returned moment state structure.
binary
    (For images only) If the flag is non-zero, all the zero pixel values are treated as zeroes, all the others are treated as 1's.
```

The function cvMoments calculates spatial and central moments up to the third order and writes them to moments. The moments may be used then to calculate gravity center of the shape, its area, main axises and various shape characeteristics including 7 Hu invariants.

GetSpatialMoment

Retrieves spatial moment from moment state structure

where I(x, y) is the intensity of the pixel (x, y).

```
\label{eq:condensity} \begin{split} &\text{double cvGetSpatialMoment( CvMoments* moments, int x_order, int y_order);} \\ &\text{moments} \\ &\text{The moment state, calculated by } \frac{\text{cvMoments}}{\text{cvMoments}}. \\ &\text{x_order} \\ &\text{x order of the retrieved moment, x_order} >= 0. \\ &\text{y_order} \\ &\text{y order of the retrieved moment, y_order} >= 0 \text{ and x_order} + \text{y_order} <= 3.} \end{split} \text{The function cvGetSpatialMoment retrieves the spatial moment, which in case of image moments is defined as:} \\ &\text{M}_{\text{x_order,y_order}} = \text{sum}_{\text{x,y}}(\text{I(x,y)} \bullet \text{x^x_order} \bullet \text{y^y_order}) \end{split}
```

GetCentralMoment

Retrieves central moment from moment state structure

```
double cvGetCentralMoment( CvMoments* moments, int x_order, int y_order );
moments
    Pointer to the moment state structure.
x_order
    x order of the retrieved moment, x_order >= 0.
y_order
    y order of the retrieved moment, y order >= 0 and x order + y order <= 3.</pre>
```

The function cvGetCentralMoment retrieves the central moment, which in case of image moments is defined as:

```
\mu_{x\_order,y\_order} = sum_{x,y} (I(x,y) \cdot (x-x_c)^{x\_order} \cdot (y-y_c)^{y\_order}),
```

where $x_c = M_{10}/M_{00}$, $y_c = M_{01}/M_{00}$ - coordinates of the gravity center

GetNormalizedCentralMoment

Retrieves normalized central moment from moment state structure

```
double cvGetNormalizedCentralMoment( CvMoments* moments, int x_order, int y_order );
moments
    Pointer to the moment state structure.
x_order
    x order of the retrieved moment, x_order >= 0.
y_order
    y order of the retrieved moment, y_order >= 0 and x_order + y_order <= 3.</pre>
```

The function cvGetNormalizedCentralMoment retrieves the normalized central moment:

$$\eta_{\text{x_order,y_order}} = ~\mu_{\text{x_order,y_order}} / \text{M}_{\text{00}} \text{((y_order+x_order)/2+1)}$$

GetHuMoments

Calculates seven Hu invariants

void cvGetHuMoments(CvMoments* moments, CvHuMoments* hu_moments);

moments

Pointer to the moment state structure.

hu_moments

Pointer to Hu moments structure.

The function cyGetHuMoments calculates seven Hu invariants that are defined as:

$$\begin{split} &h_1 = \eta_{20} + \eta_{02} \\ &h_2 = (\eta_{20} - \eta_{02})^2 + 4\eta_{11}^2 \\ &h_3 = (\eta_{30} - 3\eta_{12})^2 + (3\eta_{21} - \eta_{03})^2 \\ &h_4 = (\eta_{30} + \eta_{12})^2 + (\eta_{21} + \eta_{03})^2 \\ &h_5 = (\eta_{30} - 3\eta_{12}) (\eta_{30} + \eta_{12}) [(\eta_{30} + \eta_{12})^2 - 3(\eta_{21} + \eta_{03})^2] + (3\eta_{21} - \eta_{03}) (\eta_{21} + \eta_{03}) [3(\eta_{30} + \eta_{12})^2 - (\eta_{21} + \eta_{03})^2] \\ &h_6 = (\eta_{20} - \eta_{02}) [(\eta_{30} + \eta_{12})^2 - (\eta_{21} + \eta_{03})^2] + 4\eta_{11} (\eta_{30} + \eta_{12}) (\eta_{21} + \eta_{03}) \\ &h_7 = (3\eta_{21} - \eta_{03}) (\eta_{21} + \eta_{03}) [3(\eta_{30} + \eta_{12})^2 - (\eta_{21} + \eta_{03})^2] - (\eta_{30} - 3\eta_{12}) (\eta_{21} + \eta_{03}) [3(\eta_{30} + \eta_{12})^2 - (\eta_{21} + \eta_{03})^2] \end{split}$$

These values are proved to be invariants to the image scale, rotation, and reflection except the seventh one, whose sign is changed by reflection.

Special Image Transforms

HoughLines2

Finds lines in binary image using Hough transform

image

The input 8-bit single-channel binary image. In case of probabilistic method the image is modified by the function.

line_storage

The storage for the lines detected. It can be a memory storage (in this case a sequence of lines is created in the storage and returned by the function) or single row/single column matrix (CvMat*) of a particular type (see below) to which the lines' parameters are written. The matrix header is modified by the function so its cols or rows will contain a number of lines detected. If line_storage is a matrix and the actual number of lines exceeds the matrix size, the maximum possible number of lines is returned (in case of standard hough transform the lines are sorted by the accumulator value).

method

The Hough transform variant, one of:

- o CV_HOUGH_STANDARD classical or standard Hough transform. Every line is represented by two floating-point numbers (ρ , θ), where ρ is a distance between (0,0) point and the line, and θ is the angle between x-axis and the normal to the line. Thus, the matrix must be (the created sequence will be) of CV_32FC2 type.
- o CV_HOUGH_PROBABILISTIC probabilistic Hough transform (more efficient in case if picture contains a few long linear segments). It returns line segments rather than the whole lines. Every segment is represented by starting and ending points, and the matrix must be (the created sequence will be) of CV_32SC4 type.
- o CV_HOUGH_MULTI_SCALE multi-scale variant of classical Hough transform. The lines are encoded the same way as in CV_HOUGH_STANDARD.

rho

Distance resolution in pixel-related units.

theta

Angle resolution measured in radians.

threshold

Threshold parameter. A line is returned by the function if the corresponding accumulator value is greater than threshold.

The first method-dependent parameter:

- o For classical Hough transform it is not used (0).
- o For probabilistic Hough transform it is the minimum line length.

o For multi-scale Hough transform it is divisor for distance resolution rho. (The coarse distance resolution will be rho and the accurate resolution will be (rho / param1)).

param2

The second method-dependent parameter:

- o For classical Hough transform it is not used (0).
- o For probabilistic Hough transform it is the maximum gap between line segments lieing on the same line to treat them as the single line segment (i.e. to join them).
- o For multi-scale Hough transform it is divisor for angle resolution theta. (The coarse angle resolution will be theta and the accurate resolution will be (theta/param2)).

The function cvHoughLines2 implements a few variants of Hough transform for line detection.

Example. Detecting lines with Hough transform.

```
/* This is a standalone program. Pass an image name as a first parameter of the program.
   Switch between standard and probabilistic Hough transform by changing "#if 1" to "#if 0" and
back */
#include <cv.h>
#include <hiqhqui.h>
#include <math.h>
int main(int argc, char** argv)
    IplImage* src;
    if( argc == 2 && (src=cvLoadImage(argv[1], 0))!= 0)
        IplImage* dst = cvCreateImage( cvGetSize(src), 8, 1 );
        IplImage* color dst = cvCreateImage( cvGetSize(src), 8, 3 );
        CvMemStorage* storage = cvCreateMemStorage(0);
        CvSeq* lines = 0;
        int i;
        cvCanny( src, dst, 50, 200, 3);
        cvCvtColor( dst, color_dst, CV_GRAY2BGR );
#if 1
        lines = cvHoughLines2( dst, storage, CV HOUGH STANDARD, 1, CV PI/180, 100, 0, 0);
        for( i = 0; i < MIN(lines->total,100); i++ )
```

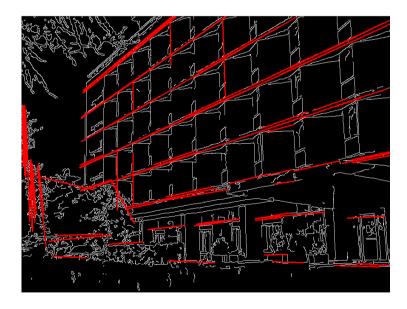
```
float* line = (float*)cvGetSegElem(lines,i);
            float rho = line[0];
            float theta = line[1];
            CvPoint pt1, pt2;
            double a = cos(theta), b = sin(theta);
            double x0 = a*rho, y0 = b*rho;
            pt1.x = cvRound(x0 + 1000*(-b));
           pt1.y = cvRound(y0 + 1000*(a));
           pt2.x = cvRound(x0 - 1000*(-b));
           pt2.y = cvRound(y0 - 1000*(a));
            cvLine( color_dst, pt1, pt2, CV_RGB(255,0,0), 3, 8 );
#else
        lines = cvHoughLines2( dst, storage, CV_HOUGH_PROBABILISTIC, 1, CV_PI/180, 80, 30, 10 );
        for( i = 0; i < lines->total; i++ )
            CvPoint* line = (CvPoint*)cvGetSeqElem(lines,i);
            cvLine( color_dst, line[0], line[1], CV_RGB(255,0,0), 3, 8 );
#endif
        cvNamedWindow( "Source", 1 );
        cvShowImage( "Source", src );
        cvNamedWindow( "Hough", 1 );
        cvShowImage( "Hough", color_dst );
        cvWaitKey(0);
```

This is the sample picture the function parameters have been tuned for:

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And this is the output of the above program in case of probabilistic Hough transform ("#if 0" case):



HoughCircles

Finds circles in grayscale image using Hough transform

image

The input 8-bit single-channel grayscale image.

circle_storage

The storage for the circles detected. It can be a memory storage (in this case a sequence of circles is created in the storage and returned by the function) or single row/single column matrix (CvMat*) of type CV_32FC3, to which the circles' parameters are written. The matrix header is modified by the function so its cols or rows will contain a number of lines detected. If circle_storage is a matrix and the actual number of lines exceeds the matrix size, the maximum possible number of circles is returned. Every circle is encoded as 3 floating-point numbers: center coordinates (x,y) and the radius.

method

Currently, the only implemented method is CV_HOUGH_GRADIENT, which is basically 21HT, described in [Yuen03].

dр

Resolution of the accumulator used to detect centers of the circles. For example, if it is 1, the accumulator will have the same resolution as the input image, if it is 2 - accumulator will have twice smaller width and height, etc.

min_dist

Minimum distance between centers of the detected circles. If the parameter is too small, multiple neighbor circles may be falsely detected in addition to a true one. If it is too large, some circles may be missed.

param1

The first method-specific parameter. In case of CV_HOUGH_GRADIENT it is the higher threshold of the two passed to Canny edge detector (the lower one will be twice smaller).

param2

The second method-specific parameter. In case of CV_HOUGH_GRADIENT it is accumulator threshold at the center detection stage. The smaller it is, the more false circles may be detected. Still, circles, corresponding to the larger accumulator values, will be returned first.

The function cvHoughCircles finds circles in grayscale image using some modification of Hough transform.

Example. Detecting circles with Hough transform.

```
#include <cv.h>
#include <highgui.h>
#include <math.h>

int main(int argc, char** argv)
{
    IplImage* img;
```

```
if ( argc == 2 \& (imq=cvLoadImage(argv[1], 1))!= 0)
       IplImage* gray = cvCreateImage( cvGetSize(img), 8, 1 );
       CvMemStorage* storage = cvCreateMemStorage(0);
       cvCvtColor( img, gray, CV_BGR2GRAY );
       cvSmooth( gray, gray, CV GAUSSIAN, 9, 9 ); // smooth it, otherwise a lot of false
circles may be detected
       CvSeq* circles = cvHoughCircles( gray, storage, CV HOUGH GRADIENT, 2, gray->height/4,
200, 100);
       int i;
       for( i = 0; i < c->total; i++ )
            float* p = (float*)cvGetSeqElem( c, i );
            cvCircle( img, cvPoint(cvRound(p[0]),cvRound(p[1])), cvRound(p[2]), CV_RGB
(255,0,0), 3, 8, 0);
       cvNamedWindow( "cicles", 1 );
       cvShowImage( "circles", img );
   return 0;
```

DistTransform

Calculates distance to closest zero pixel for all non-zero pixels of source image

mask

User-defined mask in case of user-defined distance, it consists of 2 numbers (horizontal/vertical shift cost, diagonal shift cost) in case of 3×3 mask and 3 numbers (horizontal/vertical shift cost, diagonal shift cost, knight's move cost) in case of 5×5 mask.

labels

The optional output 2d array of labels of integer type and the same size as src and dst.

The function cvDistTransform calculates the approximated distance from every binary image pixel to the nearest zero pixel. For zero pixels the function sets the zero distance, for others it finds the shortest path consisting of basic shifts: horizontal, vertical, diagonal or knight's move (the latest is available for 5×5 mask). The overal distance is calculated as a sum of these basic distances. Because the distance function should be symmetric, all the horizontal and vertical shifts must have the same cost (that is denoted as a), all the diagonal shifts must have the same cost (denoted b), and all knight's moves must have the same cost (denoted c). For CV_DIST_C and CV_DIST_L1 types the distance is calculated precisely, whereas for CV_DIST_L2 (Euclidian distance) the distance can be calculated only with some relative error (5×5 mask gives more accurate results), OpenCV uses the values suggested in [Borgefors86]:

```
CV_DIST_C (3×3):
a=1, b=1

CV_DIST_L1 (3×3):
a=1, b=2

CV_DIST_L2 (3×3):
a=0.955, b=1.3693

CV_DIST_L2 (5×5):
a=1, b=1.4, c=2.1969
```

And below are samples of distance field (black (0) pixel is in the middle of white square) in case of user-defined distance:

User-defined 3x3 mask (a=1, b=1.5)

4.5	4	3.5	3	3.5	4	4.5
4	3	2.5	2	2.5	3	4
3.5	2.5	1.5	1	1.5	2.5	3.5
3	2	1	0	1	2	3

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3.5	2.5	1.5	1	1.5	2.5	3.5
4	3	2.5	2	2.5	3	4
4.5	4	3.5	3	3.5	4	4.5

User-defined 5×5 mask (a=1, b=1.5, c=2)

4.5	3.5	3	3	3	3.5	4.5
3.5	3	2	2	2	3	3.5
3	2	1.5	1	1.5	2	3
3	2	1	0	1	2	3
3	2	1.5	1	1.5	2	3
3.5	3	2	2	2	3	3.5
4	3.5	3	3	3	3.5	4

Typically, for fast coarse distance estimation CV_DIST_L2, 3×3 mask is used, and for more accurate distance estimation CV_DIST_L2, 5×5 mask is used.

When the output parameter labels is not NULL, for every non-zero pixel the function also finds the nearest connected component consisting of zero pixels. The connected components themselves are found as contours in the beginning of the function.

In this mode the processing time is still O(N), where N is the number of pixels. Thus, the function provides a very fast way to compute approximate Voronoi diagram for the binary image.

Histograms

CvHistogram

Muti-dimensional histogram

```
typedef struct CvHistogram
{
   int   type;
   CvArr* bins;
   float   thresh[CV_MAX_DIM][2]; /* for uniform histograms */
   float** thresh2; /* for non-uniform histograms */
   CvMatND mat; /* embedded matrix header for array histograms */
}
CvHistogram;
```

CreateHist

ranges

Creates histogram

Array of ranges for histogram bins. Its meaning depends on the uniform parameter value. The ranges are used for when histogram is calculated or backprojected to determine, which histogram bin corresponds to which value/tuple of values from the input image[s].

Uniformity flag; if not 0, the histogram has evenly spaced bins and for every $0 \le i \le Dims ranges[i]$ is array of two numbers: lower and upper boundaries for the i-th histogram dimension. The whole range [lower,upper] is split then into dims[i] equal parts to determine i-th input tuple value ranges for every histogram bin. And if uniform=0, then i-th element of ranges array contains dims[i]+1 elements: lower₀, upper₀, lower₁, upper₁ == lower₂, ..., upper_{dims[i]-1}, where lower_j and upper are lower and upper boundaries of i-th input tuple value for j-th bin, respectively. In either case, the input values that are

beyond the specified range for a histogram bin, are not counted by <u>cvCalcHist</u> and filled with 0 by <u>cvCalcBackProject</u>.

The function cvCreateHist creates a histogram of the specified size and returns the pointer to the created histogram. If the array ranges is 0, the histogram bin ranges must be specified later via The function cvSetHistBinRanges, though cvCalcHist and cvCalcBackProject may process 8-bit images without setting bin ranges, they assume equally spaced in 0..255 bins.

SetHistBinRanges

Sets bounds of histogram bins

```
void cvSetHistBinRanges( CvHistogram* hist, float** ranges, int uniform=1 );
hist
    Histogram.
ranges
    Array of bin ranges arrays, see cvCreateHist.
uniform
    Uniformity flag, see cvCreateHist.
```

The function cvSetHistBinRanges is a stand-alone function for setting bin ranges in the histogram. For more detailed description of the parameters ranges and uniform see cvCalcHist function, that can initialize the ranges as well. Ranges for histogram bins must be set before the histogram is calculated or backproject of the histogram is calculated.

ReleaseHist

Releases histogram

```
void cvReleaseHist( CvHistogram** hist );
hist
```

Double pointer to the released histogram.

The function cvReleaseHist releases the histogram (header and the data). The pointer to histogram is cleared by the function. If *hist pointer is already NULL, the function does nothing.

ClearHist

Clears histogram

```
void cvClearHist( CvHistogram* hist );
hist
     Histogram.
```

The function cvClearHist sets all histogram bins to 0 in case of dense histogram and removes all histogram bins in case of sparse array.

MakeHistHeaderForArray

Makes a histogram out of array

```
CvHistogram* cvMakeHistHeaderForArray( int dims, int* sizes, CvHistogram* hist, float* data, float** ranges=NULL, int uniform=1 );

dims
    Number of histogram dimensions.
sizes
    Array of histogram dimension sizes.
hist
    The histogram header initialized by the function.
data
    Array that will be used to store histogram bins.
ranges
    Histogram bin ranges, see cvCreateHist.
uniform
    Uniformity flag, see cvCreateHist.
```

The function cvMakeHistHeaderForArray initializes the histogram, which header and bins are allocated by user. No cvReleaseHist need to be called afterwards. Only dense histograms can be initialized this way. The function returns hist.

QueryHistValue_*D

Queries value of histogram bin

```
#define cvQueryHistValue_1D( hist, idx0 ) \
    cvGetReal1D( (hist)->bins, (idx0) )
#define cvQueryHistValue_2D( hist, idx0, idx1 ) \
    cvGetReal2D( (hist)->bins, (idx0), (idx1) )
#define cvQueryHistValue_3D( hist, idx0, idx1, idx2 ) \
    cvGetReal3D( (hist)->bins, (idx0), (idx1), (idx2) )
#define cvQueryHistValue_nD( hist, idx ) \
    cvGetRealND( (hist)->bins, (idx) )

hist
    Histogram.
idx0, idx1, idx2, idx3
    Indices of the bin.
idx
    Array of indices
```

The macros <u>cvQueryHistValue_*D</u> return the value of the specified bin of 1D, 2D, 3D or N-D histogram. In case of sparse histogram the function returns 0, if the bin is not present in the histogram, and no new bin is created.

GetHistValue *D

Returns pointer to histogram bin

```
#define cvGetHistValue_1D( hist, idx0 ) \
    ((float*)(cvPtr1D( (hist)->bins, (idx0), 0 ))
#define cvGetHistValue_2D( hist, idx0, idx1 ) \
    ((float*)(cvPtr2D( (hist)->bins, (idx0), (idx1), 0 ))
#define cvGetHistValue_3D( hist, idx0, idx1, idx2 ) \
    ((float*)(cvPtr3D( (hist)->bins, (idx0), (idx1), (idx2), 0 ))
#define cvGetHistValue_nD( hist, idx ) \
    ((float*)(cvPtrND( (hist)->bins, (idx), 0 ))
hist
Histogram.
```

```
idx0, idx1, idx2, idx3
Indices of the bin.
idx
Array of indices
```

The macros <u>cvGetHistValue_*D</u> return pointer to the specified bin of 1D, 2D, 3D or N-D histogram. In case of sparse histogram the function creates a new bin and sets it to 0, unless it exists already.

GetMinMaxHistValue

Finds minimum and maximum histogram bins

The function cvGetMinMaxHistValue finds the minimum and maximum histogram bins and their positions. Any of output arguments is optional. Among several extremums with the same value the ones with minimum index (in lexicographical order) In case of several maximums or minimums the earliest in lexicographical order extrema locations are returned.

NormalizeHist

Normalizes histogram

```
void cvNormalizeHist( CvHistogram* hist, double factor );
```

hist

Pointer to the histogram.

factor

Normalization factor.

The function cvNormalizeHist normalizes the histogram bins by scaling them, such that the sum of the bins becomes equal to factor.

ThreshHist

Thresholds histogram

```
void cvThreshHist( CvHistogram* hist, double threshold );
hist
    Pointer to the histogram.
threshold
    Threshold level.
```

The function cvThreshHist clears histogram bins that are below the specified threshold.

CompareHist

Compares two dense histograms

The function cvCompareHist compares two dense histograms using the specified method as following (H_1 denotes the first histogram, H_2 - the second):

```
 \begin{split} & \text{Correlation (method=CV\_COMP\_CORREL):} \\ & \text{d}(\text{H}_1, \text{H}_2) = \text{sum}_{\text{I}}(\text{H}'_1(\text{I}) \bullet \text{H}'_2(\text{I})) / \text{sqrt}(\text{sum}_{\text{I}}[\text{H}'_1(\text{I})^2] \bullet \text{sum}_{\text{I}}[\text{H}'_2(\text{I})^2])} \\ & \text{where} \\ & \text{H}'_k(\text{I}) = \text{H}_k(\text{I}) - 1/\text{N} \bullet \text{sum}_{\text{J}} \text{H}_k(\text{J}) \text{ (N=number of histogram bins)}} \\ & \text{Chi-Square (method=CV\_COMP\_CHISQR):} \\ & \text{d}(\text{H}_1, \text{H}_2) = \text{sum}_{\text{I}}[\text{(H}_1(\text{I}) - \text{H}_2(\text{I})) / (\text{H}_1(\text{I}) + \text{H}_2(\text{I}))]} \\ & \text{Intersection (method=CV\_COMP\_INTERSECT):} \\ & \text{d}(\text{H}_1, \text{H}_2) = \text{sum}_{\text{I}} \text{max}(\text{H}_1(\text{I}), \text{H}_2(\text{I}))} \\ & \text{Bhattacharyya distance (method=CV\_COMP\_BHATTACHARYYA):} \\ & \text{d}(\text{H}_1, \text{H}_2) = \text{sqrt}(1 - \text{sum}_{\text{I}}(\text{sqrt}(\text{H}_1(\text{I}) \bullet \text{H}_2(\text{I}))))} \end{split}
```

The function returns $d(H_1, H_2)$ value.

Note: the method CV_COMP_BHATTACHARYYA only works with normalized histograms.

To compare sparse histogram or more general sparse configurations of weighted points, consider using cvCalcEMD2 function.

CopyHist

Copies histogram

```
void cvCopyHist( const CvHistogram* src, CvHistogram** dst );
src
    Source histogram.
dst
    Pointer to destination histogram.
```

The function cvCopyHist makes a copy of the histogram. If the second histogram pointer *dst is NULL, a new histogram of the same size as src is created. Otherwise, both histograms must have equal types and sizes. Then the function copies the source histogram bins values to destination histogram and sets the same bin values ranges as in src.

CalcHist

Calculates histogram of image(s)

Accumulation flag. If it is set, the histogram is not cleared in the beginning. This feature allows user to compute a single histogram from several images, or to update the histogram online.

mask

The operation mask, determines what pixels of the source images are counted.

The function cvCalcHist calculates the histogram of one or more single-channel images. The elements of a tuple that is used to increment a histogram bin are taken at the same location from the corresponding input images.

Sample. Calculating and displaying 2D Hue-Saturation histogram of a color image

```
#include <cv.h>
#include <highgui.h>

int main( int argc, char** argv )
{
    IplImage* src;
    if( argc == 2 && (src=cvLoadImage(argv[1], 1))!= 0)
    {
        IplImage* h_plane = cvCreateImage( cvGetSize(src), 8, 1 );
        IplImage* s_plane = cvCreateImage( cvGetSize(src), 8, 1 );
        IplImage* v_plane = cvCreateImage( cvGetSize(src), 8, 1 );
```

```
IplImage* planes[] = { h plane, s plane };
        IplImage* hsv = cvCreateImage( cvGetSize(src), 8, 3 );
        int h bins = 30, s bins = 32;
        int hist size[] = {h bins, s bins};
        float h_ranges[] = { 0, 180 }; /* hue varies from 0 (\sim0°red) to 180 (\sim360°red again) */
        float s_ranges[] = { 0, 255 }; /* saturation varies from 0 (black-gray-white) to 255
(pure spectrum color) */
        float* ranges[] = { h_ranges, s_ranges };
        int scale = 10;
        IplImage* hist img = cvCreateImage( cvSize(h bins*scale,s bins*scale), 8, 3 );
        CvHistogram* hist;
        float max value = 0;
        int h, s;
        cvCvtColor( src, hsv, CV BGR2HSV );
        cvCvtPixToPlane( hsv, h plane, s plane, v plane, 0 );
        hist = cvCreateHist( 2, hist_size, CV_HIST_ARRAY, ranges, 1 );
        cvCalcHist( planes, hist, 0, 0 );
        cvGetMinMaxHistValue( hist, 0, &max value, 0, 0 );
        cvZero( hist imq );
        for( h = 0; h < h bins; h++ )
            for(s = 0; s < s bins; s++)
                float bin val = cvQueryHistValue 2D( hist, h, s );
                int intensity = cvRound(bin val*255/max value);
                cvRectangle( hist img, cvPoint( h*scale, s*scale ),
                             cvPoint((h+1)*scale - 1, (s+1)*scale - 1),
                             CV_RGB(intensity,intensity), /* graw a grayscale
histogram.
                                                                       if you have idea how to
do it
                                                                       nicer let us know */
                             CV FILLED );
```

```
cvNamedWindow( "Source", 1 );
  cvShowImage( "Source", src );

cvNamedWindow( "H-S Histogram", 1 );
  cvShowImage( "H-S Histogram", hist_img );

cvWaitKey(0);
}
```

CalcBackProject

Calculates back projection

The function cvCalcBackProject calculates the back project of the histogram. For each tuple of pixels at the same position of all input single-channel images the function puts the value of the histogram bin, corresponding to the tuple, to the destination image. In terms of statistics, the value of each output image pixel is probability of the observed tuple given the distribution (histogram). For example, to find a red object in the picture, one may do the following:

- 1. Calculate a hue histogram for the red object assuming the image contains only this object. The histogram is likely to have a strong maximum, corresponding to red color.
- 2. Calculate back projection of a hue plane of input image where the object is searched, using the histogram. Threshold the image.
- 3. Find connected components in the resulting picture and choose the right component using some additional criteria, for example, the largest connected component.

That is the approximate algorithm of Camshift color object tracker, except for the 3rd step, instead of which CAMSHIFT algorithm is used to locate the object on the back projection given the previous object position.

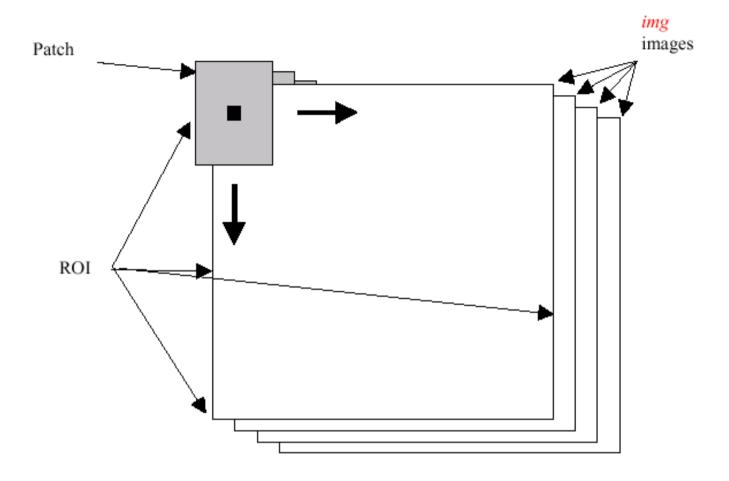
CalcBackProjectPatch

Locates a template within image by histogram comparison

The function cvCalcBackProjectPatch calculates back projection by comparing histograms of the source image patches with the given histogram. Taking measurement results from some image at each location over ROI creates an array image. These results might be one or more of hue, x derivative, y derivative, Laplacian filter, oriented Gabor filter, etc. Each measurement output is collected into its own separate image. The image image array is a collection of these measurement images. A multi-dimensional histogram hist is constructed by sampling from the image image array. The final histogram is normalized. The hist histogram has as many dimensions as the number of elements in image array.

Each new image is measured and then converted into an image image array over a chosen ROI. Histograms are taken from this image image in an area covered by a "patch" with anchor at center as shown in the picture below. The histogram is normalized using the parameter norm_factor so that it may be compared with hist. The calculated histogram is compared to the model histogram; hist uses The function cvCompareHist with the comparison method=method). The resulting output is placed at the location corresponding to the patch anchor in the probability image dst. This process is repeated as the patch is slid over the ROI. Iterative histogram update by subtracting trailing pixels covered by the patch and adding newly covered pixels to the histogram can save a lot of operations, though it is not implemented yet.

Back Project Calculation by Patches



CalcProbDensity

Divides one histogram by another

scale

scale factor for the destination histogram.

The function cvCalcProbDensity calculates the object probability density from the two histograms as:

So the destination histogram bins are within less than scale.

EqualizeHist

Equalizes histogram of grayscale image

The function cvEqualizeHist equalizes histogram of the input image using the following algorithm:

- 1. calculate histogram H for src.
- 2. normalize histogram, so that the sum of histogram bins is 255.
- 3. compute integral of the histogram: $H'(i) = sum_{0 \le i \le i} H(j)$
- 4. transform the image using H' as a look-up table: dst(x,y)=H'(src(x,y))

The algorithm normalizes brightness and increases contrast of the image.

Matching

MatchTemplate

method

Compares template against overlapped image regions

Specifies the way the template must be compared with image regions (see below).

The function cvMatchTemplate is similar to cvCalcBackProjectPatch. It slids through image, compares overlapped patches of size w×h against templ using the specified method and stores the comparison results to result. Here are the formulae for the different comparison methods one may use (I denotes image, T - template, R - result. The summation is done over template and/or the image patch: x'=0..w-1, y'=0..h-1):

After the function finishes comparison, the best matches can be found as global minimums (CV_TM_SQDIFF*) or maximums (CV_TM_CCORR* and CV_TM_CCOEFF*) using cvMinMaxLoc function. In case of color image and template summation in both numerator and each sum in denominator is done over all the channels (and separate mean values are used for each channel).

MatchShapes

Compares two shapes

Second contour or grayscale image method

 $Comparison\ method,\ one\ of\ CV_CONTOUR_MATCH_I1,\ CV_CONTOURS_MATCH_I2\ or\ CV_CONTOURS_MATCH_I3.$ parameter

Method-specific parameter (is not used now).

The function cvMatchShapes compares two shapes. The 3 implemented methods all use Hu moments (see <u>cvGetHuMoments</u>) (A ~ object1, B - object2):

```
\label{eq:match_in_match_in_match_in} $$ I_1(A,B) = sum_{i=1...7} abs(1/m^A_i - 1/m^B_i)$
```

```
\label{eq:method} \begin{split} & \text{method=CV\_CONTOUR\_MATCH\_I2:} \\ & \text{$I_2(A,B)$=$sum}_{i=1..7} \text{abs}(\text{$m^A}_i - \text{$m^B}_i) \\ & \text{method=CV\_CONTOUR\_MATCH\_I3:} \\ & \text{$I_3(A,B)$=$sum}_{i=1..7} \text{abs}(\text{$m^A}_i - \text{$m^B}_i) / \text{abs}(\text{$m^A}_i) \\ & \text{where} \\ & \text{$m^A}_i = \text{sign}(\text{$h^A}_i) \cdot \log(\text{$h^A}_i) \,, \\ & \text{$m^B}_i = \text{sign}(\text{$h^B}_i) \cdot \log(\text{$h^B}_i) \,, \\ & \text{$h^A}_i, \ h^B_i - \text{Hu moments of A and B, respectively.} \end{split}
```

CalcEMD2

Computes "minimal work" distance between two weighted point configurations

First signature, size1×dims+1 floating-point matrix. Each row stores the point weight followed by the point coordinates. The matrix is allowed to have a single column (weights only) if the user-defined cost matrix is used.

signature2

Second signature of the same format as signature1, though the number of rows may be different. The total weights may be different, in this case an extra "dummy" point is added to either signature1 or signature2.

distance_type

Metrics used; CV_DIST_L1, CV_DIST_L2, and CV_DIST_C stand for one of the standard metrics; CV_DIST_USER means that a user-defined function distance_func or pre-calculated cost_matrix is used.

distance_func

The user-defined distance function. It takes coordinates of two points and returns the distance between the points. cost_matrix

The user-defined size1×size2 cost matrix. At least one of cost_matrix and distance_func must be NULL. Also, if a cost matrix is used, lower boundary (see below) can not be calculated, because it needs a metric function.

flow

The resultant size1×size2 flow matrix: flow; is a flow from i-th point of signature1 to j-th point of signature2

lower bound

Optional input/output parameter: lower boundary of distance between the two signatures that is a distance between mass centers. The lower boundary may not be calculated if the user-defined cost matrix is used, the total weights of point configurations are not equal, or there is the signatures consist of weights only (i.e. the signature matrices have a single column). User *must* initialize *lower_bound. If the calculated distance between mass centers is greater or equal to *lower_bound (it means that the signatures are far enough) the function does not calculate EMD. In any case *lower_bound is set to the calculated distance between mass centers on return. Thus, if user wants to calculate both distance between mass centers and EMD, *lower_bound should be set to 0.

userdata

Pointer to optional data that is passed into the user-defined distance function.

The function cvCalcEMD2 computes earth mover distance and/or a lower boundary of the distance between the two weighted point configurations. One of the application described in [RubnerSept98] is multi-dimensional histogram comparison for image retrieval. EMD is a transportation problem that is solved using some modification of simplex algorithm, thus the complexity is exponential in the worst case, though, it is much faster in average. In case of a real metric the lower boundary can be calculated even faster (using linear-time algorithm) and it can be used to determine roughly whether the two signatures are far enough so that they cannot relate to the same object.

Structural Analysis

Contour Processing Functions

ApproxChains

Approximates Freeman chain(s) with polygonal curve

src seq

Pointer to the chain that can refer to other chains.

storage

Storage location for the resulting polylines.

method

Approximation method (see the description of the function <u>cvFindContours</u>).

parameter

Method parameter (not used now).

minimal_perimeter

Approximates only those contours whose perimeters are not less than minimal_perimeter. Other chains are removed from the resulting structure.

recursive

If not 0, the function approximates all chains that access can be obtained to from src_seq by h_next or v_next links. If 0, the single chain is approximated.

This is a stand-alone approximation routine. The function cvApproxChains works exactly in the same way as <u>cvFindContours</u> with the corresponding approximation flag. The function returns pointer to the first resultant contour. Other approximated contours, if any, can be accessed via v_next or h_next fields of the returned structure.

StartReadChainPoints

Initializes chain reader

```
void cvStartReadChainPoints( CvChain* chain, CvChainPtReader* reader );
```

chain Pointer to chain, reader Chain reader state.

The function cvStartReadChainPoints initializes a special reader (see <u>Dynamic Data Structures</u> for more information on sets and sequences).

ReadChainPoint

Gets next chain point

```
CvPoint cvReadChainPoint( CvChainPtReader* reader );
```

reader

Chain reader state.

The function cvReadChainPoint returns the current chain point and updates the reader position.

ApproxPoly

Approximates polygonal curve(s) with desired precision

If case if src_seq is sequence it means whether the single sequence should be approximated or all sequences on the same level or below src_seq (see cvFindContours for description of hierarchical contour structures). And if src_seq is array (cvMat*) of points, the parameter specifies whether the curve is closed (parameter 2!=0) or not (parameter 2=0).

The function cvApproxPoly approximates one or more curves and returns the approximation result[s]. In case of multiple curves approximation the resultant tree will have the same structure as the input one (1:1 correspondence).

BoundingRect

parameter2

Calculates up-right bounding rectangle of point set

```
CvRect cvBoundingRect( CvArr* points, int update=0 );
points
        2D point set, either a sequence or vector (CvMat) of points.
update
```

The update flag. Here is list of possible combination of the flag values and type of contour:

- o update=0, contour ~ CvContour*: the bounding rectangle is not calculated, but it is taken from rect field of the contour header.
- o update=1, contour ~ CvContour*: the bounding rectangle is calculated and written to rect field of the contour header.
- o update=0, contour ~ CvSeq* or CvMat*: the bounding rectangle is calculated and returned.
- o update=1, contour ~ CvSeq* or CvMat*: runtime error is raised.

The function cvBoundingRect returns the up-right bounding rectangle for 2d point set.

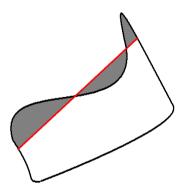
ContourArea

Calculates area of the whole contour or contour section

```
double cvContourArea( const CvArr* contour, CvSlice slice=CV_WHOLE_SEQ );
contour
     Contour (sequence or array of vertices).
slice
```

Starting and ending points of the contour section of interest, by default area of the whole contour is calculated.

The function cvContourArea calculates area of the whole contour or contour section. In the latter case the total area bounded by the contour arc and the chord connecting the 2 selected points is calculated as shown on the picture below:



NOTE: Orientation of the contour affects the area sign, thus the function may return negative result. Use fabs () function from C runtime to get the absolute value of area.

ArcLength

Calculates contour perimeter or curve length

is_closed
Indicates whether the curve is closed or not. There are 3 cases:

- o is closed=0 the curve is assumed to be unclosed.
- o is closed>0 the curve is assumed to be closed.
- o is_closed<0 if curve is sequence, the flag CV_SEQ_FLAG_CLOSED of ((CvSeq*)curve)->flags is checked to determine if the curve is closed or not, otherwise (curve is represented by array (CvMat*) of points) it is assumed to be unclosed.

The function cvArcLength calculates length or curve as sum of lengths of segments between subsequent points

CreateContourTree

Creates hierarchical representation of contour

 $\label{lem:cvContourTree} CvContourTree (\ const \ CvSeq* \ contour, \ CvMemStorage* \ storage, \ double \ threshold);$

contour

Input contour.

storage

Container for output tree.

threshold

Approximation accuracy.

The function cvCreateContourTree creates binary tree representation for the input contour and returns the pointer to its root. If the parameter threshold is less than or equal to 0, the function creates full binary tree representation. If the threshold is greater than 0, the function creates representation with the precision threshold: if the vertices with the interceptive area of its base line are less than threshold, the tree should not be built any further. The function returns the created tree.

ContourFromContourTree

Restores contour from tree

```
CvSeq* cvContourFromContourTree( const CvContourTree* tree, CvMemStorage* storage, CvTermCriteria criteria);

tree
Contour tree.
storage
Container for the reconstructed contour.
criteria
Criteria, where to stop reconstruction.
```

The function cvContourFromContourTree restores the contour from its binary tree representation. The parameter criteria determines the accuracy and/or the number of tree levels used for reconstruction, so it is possible to build approximated contour. The function returns reconstructed contour.

MatchContourTrees

Compares two contours using their tree representations

The function cvMatchContourTrees calculates the value of the matching measure for two contour trees. The similarity measure is calculated level by level from the binary tree roots. If at the certain level difference between contours becomes less than threshold, the reconstruction process is interrupted and the current difference is returned.

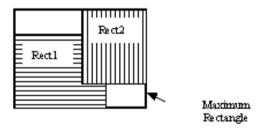
Computational Geometry

MaxRect

Finds bounding rectangle for two given rectangles

```
CvRect cvMaxRect( const CvRect* rect1, const CvRect* rect2 );
rect1
    First rectangle
rect2
    Second rectangle
```

The function cvMaxRect finds minimum area rectangle that contains both input rectangles inside:



CvBox2D

Rotated 2D box

```
typedef struct CvBox2D
{
    CvPoint2D32f center; /* center of the box */
```

PointSeqFromMat

Initializes point sequence header from a point vector

The function cvPointSeqFromMat initializes sequence header to create a "virtual" sequence which elements reside in the specified matrix. No data is copied. The initialized sequence header may be passed to any function that takes a point sequence on input. No extra elements could be added to the sequence, but some may be removed. The function is a specialized variant of cvMakeSeqHeaderForArray and uses the latter internally. It returns pointer to the initialized contour header. Note that the bounding rectangle (field rect of CvContour strucuture is not initialized by the function. If you need one, use cvBoundingRect.

Here is the simple usage example.

```
CvContour header;
CvSeqBlock block;
CvMat* vector = cvCreateMat( 1, 3, CV_32SC2 );
CV_MAT_ELEM( *vector, CvPoint, 0, 0 ) = cvPoint(100,100);
```

```
CV_MAT_ELEM( *vector, CvPoint, 0, 1 ) = cvPoint(100,200);
CV_MAT_ELEM( *vector, CvPoint, 0, 2 ) = cvPoint(200,100);

IplImage* img = cvCreateImage( cvSize(300,300), 8, 3 );
cvZero(img);

cvDrawContours( img, cvPointSeqFromMat(CV_SEQ_KIND_CURVE+CV_SEQ_FLAG_CLOSED, vector, &header, &block), CV_RGB(255,0,0), CV_RGB(255,0,0), 0, 3, 8, cvPoint(0,0));
```

CvBox2D

Rotated 2D box

BoxPoints

Finds box vertices

```
void cvBoxPoints( CvBox2D box, CvPoint2D32f pt[4] );
box
     Box
pt
     Array of vertices
```

The function cvBoxPoints calculates vertices of the input 2d box. Here is the function code:

```
void cvBoxPoints( CvBox2D box, CvPoint2D32f pt[4] )
```

```
OpenCV: Image Processing and Computer Vision Reference Manual

{
    float a = (float)cos(box.angle)*0.5f;
    float b = (float)sin(box.angle)*0.5f;

    pt[0].x = box.center.x - a*box.size.height - b*box.size.width;
    pt[0].y = box.center.y + b*box.size.height - a*box.size.width;
    pt[1].x = box.center.x + a*box.size.height - b*box.size.width;
    pt[1].y = box.center.y - b*box.size.height - a*box.size.width;
    pt[2].x = 2*box.center.x - pt[0].x;
    pt[2].y = 2*box.center.y - pt[0].y;
    pt[3].x = 2*box.center.x - pt[1].x;
    pt[3].y = 2*box.center.y - pt[1].y;
```

FitEllipse

Fits ellipse to set of 2D points

```
CvBox2D cvFitEllipse2( const CvArr* points );
points
```

Sequence or array of points.

The function cvFitEllipse calculates ellipse that fits best (in least-squares sense) to a set of 2D points. The meaning of the returned structure fields is similar to those in cvEllipse except that size stores the full lengths of the ellipse axises, not half-lengths

FitLine

Fits line to 2D or 3D point set

The distance used for fitting (see the discussion).

param

Numerical parameter (C) for some types of distances, if 0 then some optimal value is chosen.

reps, aeps

Sufficient accuracy for radius (distance between the coordinate origin and the line) and angle, respectively, 0.01 would be a good defaults for both. is used.

line

The output line parameters. In case of 2d fitting it is array of 4 floats (vx, vy, x0, y0) where (vx, vy) is a normalized vector collinear to the line and (x0, y0) is some point on the line. In case of 3D fitting it is array of 6 floats (vx, vy, vz, x0, y0, z0) where (vx, vy, vz) is a normalized vector collinear to the line and (x0, y0, z0) is some point on the line.

The function cvFitLine fits line to 2D or 3D point set by minimizing $sum_i\rho(r_i)$, where r_i is distance between i-th point and the line and $\rho(r)$ is a distance function, one of:

```
dist_type=CV_DIST_L2 (L_2):  \rho(r) = r^2/2 \text{ (the simplest and the fastest least-squares method)}   \text{dist_type=CV_DIST_L1 (L_1):}   \rho(r) = r   \text{dist_type=CV_DIST_L12 (L_1-L_2):}   \rho(r) = 2 \cdot [\text{sqrt}(1+r^2/2) - 1]   \text{dist_type=CV_DIST_FAIR (Fair):}   \rho(r) = C^2 \cdot [r/C - \log(1 + r/C)], \quad C = 1.3998   \text{dist_type=CV_DIST_WELSCH (Welsch):}   \rho(r) = C^2/2 \cdot [1 - \exp(-(r/C)^2)], \quad C = 2.9846   \text{dist_type=CV_DIST_HUBER (Huber):}   \rho(r) = r^2/2, \quad \text{if } r < C   C \cdot (r - C/2), \quad \text{otherwise;} \quad C = 1.345
```

ConvexHull2

Finds convex hull of point set

The function cvConvexHull2 finds convex hull of 2D point set using Sklansky's algorithm. If hull_storage is memory storage, the function creates a sequence containing the hull points or pointers to them, depending on return_points value and returns the sequence on output.

Example. Building convex hull for a sequence or array of points

hull_storage is memory storage.

```
for(;;)
        int i, count = rand()%100 + 1, hullcount;
        CvPoint pt0;
#if !ARRAY
        CvSeq* ptseq = cvCreateSeq( CV_SEQ_KIND_GENERIC|CV_32SC2, sizeof(CvContour),
                                     sizeof(CvPoint), storage );
        CvSeq* hull;
        for(i = 0; i < count; i++)
           pt0.x = rand() % (imq->width/2) + imq->width/4;
           pt0.y = rand() % (img->height/2) + img->height/4;
            cvSeqPush( ptseq, &pt0 );
        hull = cvConvexHull2( ptseq, 0, CV_CLOCKWISE, 0 );
        hullcount = hull->total;
#else
        CvPoint* points = (CvPoint*)malloc( count * sizeof(points[0]));
        int* hull = (int*)malloc( count * sizeof(hull[0]));
        CvMat point mat = cvMat( 1, count, CV 32SC2, points );
        CvMat hull mat = cvMat( 1, count, CV 32SC1, hull );
        for(i = 0; i < count; i++)
           pt0.x = rand() % (imq -> width/2) + imq -> width/4;
           pt0.y = rand() % (img->height/2) + img->height/4;
           points[i] = pt0;
        cvConvexHull2( &point_mat, &hull_mat, CV_CLOCKWISE, 0 );
        hullcount = hull mat.cols;
#endif
        cvZero( img );
        for(i = 0; i < count; i++)
#if !ARRAY
            pt0 = *CV GET SEQ ELEM( CvPoint, ptseq, i );
```

```
#else
            pt0 = points[i];
#endif
            cvCircle( img, pt0, 2, CV_RGB( 255, 0, 0 ), CV_FILLED );
#if !ARRAY
        pt0 = **CV_GET_SEQ_ELEM( CvPoint*, hull, hullcount - 1 );
#else
        pt0 = points[hull[hullcount-1]];
#endif
        for( i = 0; i < hullcount; i++ )</pre>
#if !ARRAY
            CvPoint pt = **CV_GET_SEQ_ELEM( CvPoint*, hull, i );
#else
            CvPoint pt = points[hull[i]];
#endif
            cvLine( img, pt0, pt, CV_RGB( 0, 255, 0 ));
            pt0 = pt;
        cvShowImage( "hull", img );
        int key = cvWaitKey(0);
        if( key == 27 ) // 'ESC'
            break;
#if !ARRAY
        cvClearMemStorage( storage );
#else
        free( points );
        free( hull );
#endif
```

CheckContourConvexity

Tests contour convex

```
int cvCheckContourConvexity( const CvArr* contour );
contour
    Tested contour (sequence or array of points).
```

The function cvCheckContourConvexity tests whether the input contour is convex or not. The contour must be simple, i.e. without self-intersections.

CvConvexityDefect

Structure describing a single contour convexity detect

```
typedef struct CvConvexityDefect
{
    CvPoint* start; /* point of the contour where the defect begins */
    CvPoint* end; /* point of the contour where the defect ends */
    CvPoint* depth_point; /* the farthest from the convex hull point within the defect */
    float depth; /* distance between the farthest point and the convex hull */
} CvConvexityDefect;
```

Picture. Convexity defects of hand contour.



ConvexityDefects

Finds convexity defects of contour

contour

Input contour.

convexhull

Convex hull obtained using <u>cvConvexHull2</u> that should contain pointers or indices to the contour points, not the hull points themselves, i.e. return_points parameter in <u>cvConvexHull2</u> should be 0.

storage

Container for output sequence of convexity defects. If it is NULL, contour or hull (in that order) storage is used.

The function cvConvexityDefects finds all convexity defects of the input contour and returns a sequence of the CvConvexityDefect structures.

PointPolygonTest

Point in contour test

CvPoint2D32f pt, int measure_dist);

contour

Input contour.

pt

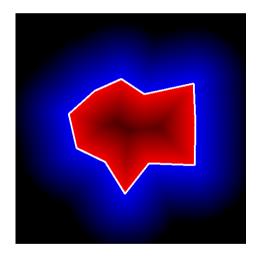
The point tested against the contour.

measure dist

If it is non-zero, the function estimates distance from the point to the nearest contour edge.

The function cvPointPolygonTest determines whether the point is inside contour, outside, or lies on an edge (or coinsides with a vertex). It returns positive, negative or zero value, correspondingly. When measure_dist=0, the return value is +1, -1 and 0, respectively. When measure_dist $\neq 0$, it is a signed distance between the point and the nearest contour edge.

Here is the sample output of the function, where each image pixel is tested against the contour.



MinAreaRect2

Finds circumscribed rectangle of minimal area for given 2D point set

CvBox2D cvMinAreaRect2(const CvArr* points, CvMemStorage* storage=NULL);

points

Sequence or array of points.

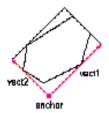
file:///C|/Programme/OpenCV/docs/ref/opencvref_cv.htm (86 von 152)06.02.2006 20:50:24

storage

Optional temporary memory storage.

The function cvMinAreaRect2 finds a circumscribed rectangle of the minimal area for 2D point set by building convex hull for the set and applying rotating calipers technique to the hull.

Picture. Minimal-area bounding rectangle for contour



MinEnclosingCircle

Finds circumscribed circle of minimal area for given 2D point set

int cvMinEnclosingCircle(const CvArr* points, CvPoint2D32f* center, float* radius);

points

Sequence or array of 2D points.

center

Output parameter. The center of the enclosing circle.

radius

Output parameter. The radius of the enclosing circle.

The function cvMinEnclosingCircle finds the minimal circumscribed circle for 2D point set using iterative algorithm. It returns nonzero if the resultant circle contains all the input points and zero otherwise (i.e. algorithm failed).

CalcPGH

Calculates pair-wise geometrical histogram for contour

```
void cvCalcPGH( const CvSeq* contour, CvHistogram* hist );

contour
    Input contour. Currently, only integer point coordinates are allowed.
hist
    Calculated histogram; must be two-dimensional.
```

The function cvCalcPGH calculates 2D pair-wise geometrical histogram (PGH), described in [Iivarinen97], for the contour. The algorithm considers every pair of the contour edges. The angle between the edges and the minimum/maximum distances are determined for every pair. To do this each of the edges in turn is taken as the base, while the function loops through all the other edges. When the base edge and any other edge are considered, the minimum and maximum distances from the points on the non-base edge and line of the base edge are selected. The angle between the edges defines the row of the histogram in which all the bins that correspond to the distance between the calculated minimum and maximum distances are incremented (that is, the histogram is transposed relatively to [Iivarninen97] definition). The histogram can be used for contour matching.

Planar Subdivisions

CvSubdiv2D

```
Planar subdivision
```

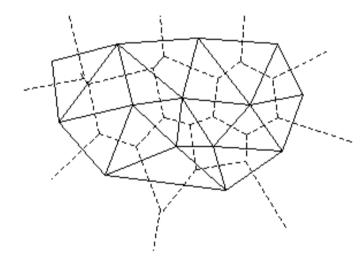
```
#define CV_SUBDIV2D_FIELDS()
    CV_GRAPH_FIELDS()
    int quad_edges;
    int is_geometry_valid;
    CvSubdiv2DEdge recent_edge; \
    CvPoint2D32f topleft;
    CvPoint2D32f bottomright;
```

typedef struct CvSubdiv2D

```
{
     CV_SUBDIV2D_FIELDS()
}
CvSubdiv2D;
```

Planar subdivision is a subdivision of a plane into a set of non-overlapped regions (facets) that cover the whole plane. The above structure describes a subdivision built on 2d point set, where the points are linked together and form a planar graph, which, together with a few edges connecting exterior subdivision points (namely, convex hull points) with infinity, subdivides a plane into facets by its edges.

For every subdivision there exists dual subdivision there facets and points (subdivision vertices) swap their roles, that is, a facet is treated as a vertex (called virtual point below) of dual subdivision and the original subdivision vertices become facets. On the picture below original subdivision is marked with solid lines and dual subdivision with dot lines



OpenCV subdivides plane into triangles using Delaunay's algorithm. Subdivision is built iteratively starting from a dummy triangle that includes all the subdivision points for sure. In this case the dual subdivision is Voronoi diagram of input 2d point set. The subdivisions can be used for 3d piece-wise transformation of a plane, morphing, fast location of points on the plane, building special graphs (such as NNG,RNG) etc.

CvQuadEdge2D

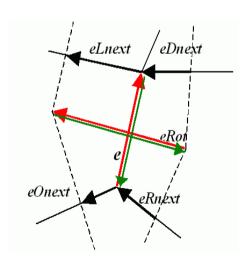
```
Quad-edge of planar subdivision

/* one of edges within quad-edge, lower 2 bits is index (0..3)
    and upper bits are quad-edge pointer */
typedef long CvSubdiv2DEdge;

/* quad-edge structure fields */
#define CV_QUADEDGE2D_FIELDS() \
    int flags; \
    struct CvSubdiv2DPoint* pt[4]; \
    CvSubdiv2DEdge next[4];

typedef struct CvQuadEdge2D
{
    CV_QUADEDGE2D_FIELDS()
}
CvQuadEdge2D;
```

Quad-edge is a basic element of subdivision, it contains four edges (e, eRot and reversed e & eRot):



CvSubdiv2DPoint

Subdiv2DGetEdge

```
Returns one of edges related to given
CvSubdiv2DEdge cvSubdiv2DGetEdge( CvSubdiv2DEdge edge, CvNextEdgeType type );
#define cvSubdiv2DNextEdge( edge ) cvSubdiv2DGetEdge( edge, CV NEXT AROUND ORG )
edge
    Subdivision edge (not a quad-edge)
type
    Specifies, which of related edges to return, one of:
       o CV NEXT AROUND ORG - next around the edge origin (eOnext on the picture above if e is
         the input edge)
       o CV NEXT AROUND DST - next around the edge vertex (eDnext)
       o CV_PREV_AROUND_ORG - previous around the edge origin (reversed eRnext)
       o CV_PREV_AROUND_DST - previous around the edge destination (reversed eLnext)
       o CV NEXT AROUND LEFT - next around the left facet (eLnext)
       o CV NEXT AROUND RIGHT - next around the right facet (eRnext)
       o CV_PREV_AROUND_LEFT - previous around the left facet (reversed eOnext)
       o CV PREV AROUND RIGHT - previous around the right facet (reversed eDnext)
```

The function cvSubdiv2DGetEdge returns one the edges related to the input edge.

o 3 - the reversed rotated edge (reversed eRot (in green))

Subdiv2DRotateEdge

Returns another edge of the same quad-edge

CvSubdiv2DEdge cvSubdiv2DRotateEdge(CvSubdiv2DEdge edge, int rotate);

edge
 Subdivision edge (not a quad-edge)

type

Specifies, which of edges of the same quad-edge as the input one to return, one of:
 o 0 - the input edge (e on the picture above if e is the input edge)
 o 1 - the rotated edge (eRot)
 o 2 - the reversed edge (reversed e (in green))

The function cvSubdiv2DRotateEdge returns one the edges of the same quad-edge as the input edge.

Subdiv2DEdgeOrg

```
Returns edge origin

CvSubdiv2DPoint* cvSubdiv2DEdgeOrg( CvSubdiv2DEdge edge );

edge

Subdivision edge (not a quad-edge)
```

The function cvSubdiv2DEdgeOrg returns the edge origin. The returned pointer may be NULL if the edge is from dual subdivision and the virtual point coordinates are not calculated yet. The virtual points can be calculated using function cvCalcSubdivVoronoi2D.

Subdiv2DEdgeDst

Returns edge destination

```
CvSubdiv2DPoint* cvSubdiv2DEdgeDst( CvSubdiv2DEdge edge );
edge
    Subdivision edge (not a guad-edge)
```

The function cvSubdiv2DEdgeDst returns the edge destination. The returned pointer may be NULL if the edge is from dual subdivision and the virtual point coordinates are not calculated yet. The virtual points can be calculated using function cvCalcSubdivVoronoi2D.

CreateSubdivDelaunay2D

Creates empty Delaunay triangulation

```
CvSubdiv2D* cvCreateSubdivDelaunay2D( CvRect rect, CvMemStorage* storage );

rect

Rectangle that includes all the 2d points that are to be added to subdivision.

storage
```

Container for subdivision.

The function cvCreateSubdivDelaunay2D creates an empty Delaunay subdivision, where 2d points can be added further using function cvSubdivDelaunay2DInsert. All the points to be added must be within the specified rectangle, otherwise a runtime error will be raised.

SubdivDelaunay2DInsert

```
Inserts a single point to Delaunay triangulation

CvSubdiv2DPoint* cvSubdivDelaunay2DInsert( CvSubdiv2D* subdiv, CvPoint2D32f pt);

subdiv

Delaunay subdivision created by function cvCreateSubdivDelaunay2D.
```

pt

Inserted point.

The function cvSubdivDelaunay2DInsert inserts a single point to subdivision and modifies the subdivision topology appropriately. If a points with same coordinates exists already, no new points is added. The function returns pointer to the allocated point. No virtual points coordinates is calculated at this stage.

Subdiv2DLocate

Inserts a single point to Delaunay triangulation

The point to locate.

edge

The output edge the point falls onto or right to.

Optional output vertex double pointer the input point coinsides with.

The function cvSubdiv2DLocate locates input point within subdivision. There are 5 cases:

- point falls into some facet. The function returns CV_PTLOC_INSIDE and *edge will contain one of edges of the facet.
- point falls onto the edge. The function returns CV_PTLOC_ON_EDGE and *edge will contain this edge.
- point coinsides with one of subdivision vertices. The function returns CV_PTLOC_VERTEX and *vertex will contain pointer to the vertex.
- point is outside the subdivsion reference rectangle. The function returns CV_PTLOC_OUTSIDE_RECT and no pointers is filled.
- one of input arguments is invalid. Runtime error is raised or, if silent or "parent" error processing mode is selected, CV_PTLOC_ERROR is returnd.

FindNearestPoint2D

```
Finds the closest subdivision vertex to given point

CvSubdiv2DPoint* cvFindNearestPoint2D( CvSubdiv2D* subdiv, CvPoint2D32f pt );

subdiv

Delaunay or another subdivision.

pt

Input point.
```

The function cvFindNearestPoint2D is another function that locates input point within subdivision. It finds subdivision vertex that is the closest to the input point. It is not necessarily one of vertices of the facet containing the input point, though the facet (located using cvSubdiv2DLocate) is used as a starting point. The function returns pointer to the found subdivision vertex

CalcSubdivVoronoi2D

The function cvCalcSubdivVoronoi2D calculates coordinates of virtual points. All virtual points corresponding to some vertex of original subdivision form (when connected together) a boundary of Voronoi cell of that point.

ClearSubdivVoronoi2D

Removes all virtual points

void cvClearSubdivVoronoi2D(CvSubdiv2D* subdiv);

subdiv

Delaunay subdivision.

The function cvClearSubdivVoronoi2D removes all virtual points. It is called internally in cvCalcSubdivVoronoi2D if the subdivision was modified after previous call to the function.

There are a few other lower-level functions that work with planar subdivisions, see cv.h and the sources. Demo script delaunay.c that builds Delaunay triangulation and Voronoi diagram of random 2d point set can be found at opency/samples/c.

Motion Analysis and Object Tracking Reference

Accumulation of Background Statistics

Acc

The function cvAcc adds the whole image image or its selected region to accumulator sum:

```
sum(x,y)=sum(x,y)+image(x,y) if mask(x,y)!=0
```

SquareAcc

Accumulator of the same number of channels as input image, 32-bit or 64-bit floating-point.

mask

Optional operation mask.

The function cvSquareAcc adds the input image image or its selected region, raised to power 2, to the accumulator sqsum:

```
sqsum(x,y)=sqsum(x,y)+image(x,y)^2 if mask(x,y)!=0
```

MultiplyAcc

```
Adds product of two input images to accumulator
```

void cvMultiplyAcc(const CvArr* image1, const CvArr* image2, CvArr* acc, const CvArr*
mask=NULL);

image1

First input image, 1- or 3-channel, 8-bit or 32-bit floating point (each channel of multichannel image is processed independently).

image2

Second input image, the same format as the first one.

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acc

Accumulator of the same number of channels as input images, 32-bit or 64-bit floating-point.

mask

Optional operation mask.

The function cvMultiplyAcc adds product of 2 images or thier selected regions to accumulator acc:

```
acc(x,y) = acc(x,y) + image1(x,y) \cdot image2(x,y) if mask(x,y)! = 0
```

RunningAvg

Updates running average

void cvRunningAvg(const CvArr* image, CvArr* acc, double alpha, const CvArr* mask=NULL);

image

Input image, 1- or 3-channel, 8-bit or 32-bit floating point (each channel of multichannel image is processed independently).

acc

Accumulator of the same number of channels as input image, 32-bit or 64-bit floating-point.

alpha

Weight of input image.

mask

Optional operation mask.

The function cvRunningAvg calculates weighted sum of input image image and the accumulator acc so that acc becomes a running average of frame sequence:

```
acc(x,y)=(1-\alpha) \cdot acc(x,y) + \alpha \cdot image(x,y) \text{ if } mask(x,y)!=0
```

where α (alpha) regulates update speed (how fast accumulator forgets about previous frames).

Motion Templates

UpdateMotionHistory

```
Updates motion history image by moving silhouette
void cvUpdateMotionHistory( const CvArr* silhouette, CvArr* mhi,
                             double timestamp, double duration );
silhouette
     Silhouette mask that has non-zero pixels where the motion occurs.
mhi
     Motion history image, that is updated by the function (single-channel, 32-bit floating-
     point)
timestamp
     Current time in milliseconds or other units.
duration
     Maximal duration of motion track in the same units as timestamp.
The function cvUpdateMotionHistory updates the motion history image as following:
mhi(x,y) = timestamp if silhouette(x,y)!=0
                    if silhouette(x,y)=0 and mhi(x,y)<timestamp-duration
         mhi(x,y)
                    otherwise
That is, MHI pixels where motion occurs are set to the current timestamp, while the pixels
where motion happened far ago are cleared.
```

CalcMotionGradient

Motion history image.

mask

Mask image; marks pixels where motion gradient data is correct. Output parameter.

Motion gradient orientation image; contains angles from 0 to $\sim 360^{\circ}$. delta1, delta2

The function finds minimum (m(x,y)) and maximum (M(x,y)) mhi values over each pixel (x,y) neihborhood and assumes the gradient is valid only if

 $min(delta1, delta2) \le M(x,y) - m(x,y) \le max(delta1, delta2)$.

aperture_size

Aperture size of derivative operators used by the function: CV_SCHARR, 1, 3, 5 or 7 (see cvSobel).

The function cvCalcMotionGradient calculates the derivatives Dx and Dy of mhi and then calculates gradient orientation as:

```
orientation(x,y)=arctan(Dy(x,y)/Dx(x,y))
```

where both Dx(x,y)' and Dy(x,y)' signs are taken into account (as in $\underline{cvCartToPolar}$ function). After that mask is filled to indicate where the orientation is valid (see delta1 and delta2 description).

CalcGlobalOrientation

Calculates global motion orientation of some selected region

double cvCalcGlobalOrientation(const CvArr* orientation, const CvArr* mask, const CvArr* mhi, double timestamp, double duration);

orientation

Motion gradient orientation image; calculated by the function cvCalcMotionGradient.

mask

Mask image. It may be a conjunction of valid gradient mask, obtained with <u>cvCalcMotionGradient</u> and mask of the region, whose direction needs to be calculated.

mhi

Motion history image.

timestamp

Current time in milliseconds or other units, it is better to store time passed to cvUpdateMotionHistory before and reuse it here, because running cvUpdateMotionHistory and cvCalcMotionGradient on large images may take some time.

duration

Maximal duration of motion track in milliseconds, the same as in cvUpdateMotionHistory.

The function cvCalcGlobalOrientation calculates the general motion direction in the selected region and returns the angle between 0° and 360°. At first the function builds the orientation histogram and finds the basic orientation as a coordinate of the histogram maximum. After that the function calculates the shift relative to the basic orientation as a weighted sum of all orientation vectors: the more recent is the motion, the greater is the weight. The resultant angle is a circular sum of the basic orientation and the shift.

SegmentMotion

Segments whole motion into separate moving parts

mhi

Motion history image.

seg_mask

Image where the mask found should be stored, single-channel, 32-bit floating-point. storage

Memory storage that will contain a sequence of motion connected components.

Current time in milliseconds or other units.

Segmentation threshold; recommended to be equal to the interval between motion history "steps" or greater.

The function cvSegmentMotion finds all the motion segments and marks them in seg_mask with individual values each (1,2,...). It also returns a sequence of CvConnectedComp structures, one per each motion components. After than the motion direction for every component can be

calculated with cvCalcGlobalOrientation using extracted mask of the particular component (using cvCmp)

Object Tracking

MeanShift

The function cvMeanShift iterates to find the object center given its back projection and initial position of search window. The iterations are made until the search window center moves by less than the given value and/or until the function has done the maximum number of iterations. The function returns the number of iterations made.

CamShift

```
Back projection of object histogram (see <a href="mailto:cvCalcBackProject">cvCalcBackProject</a>).

window
Initial search window.

criteria
Criteria applied to determine when the window search should be finished.

comp
Resultant structure that contains converged search window coordinates (comp->rect field) and sum of all pixels inside the window (comp->area field).

box
Circumscribed box for the object. If not NULL, contains object size and orientation.
```

The function cvCamShift implements CAMSHIFT object tracking algorithm ([Bradski98]). First, it finds an object center using cvMeanShift and, after that, calculates the object size and orientation. The function returns number of iterations made within cvMeanShift.

<u>CvCamShiftTracker</u> class declared in cv.hpp implements color object tracker that uses the function.

Snakelmage

Changes contour position to minimize its energy

Weight[s] of curvature energy, similar to alpha.

gamma

Weight[s] of image energy, similar to alpha.
coeff usage

Variant of usage of the previous three parameters:

- o CV_VALUE indicates that each of alpha, beta, gamma is a pointer to a single value to be used for all points;
- o CV_ARRAY indicates that each of alpha, beta, gamma is a pointer to an array of coefficients different for all the points of the snake. All the arrays must have the size equal to the contour size.

win

Size of neighborhood of every point used to search the minimum, both win.width and win. height must be odd.

criteria

Termination criteria.

calc gradient

Gradient flag. If not 0, the function calculates gradient magnitude for every image pixel and consideres it as the energy field, otherwise the input image itself is considered.

The function cvSnakeImage updates snake in order to minimize its total energy that is a sum of internal energy that depends on contour shape (the smoother contour is, the smaller internal energy is) and external energy that depends on the energy field and reaches minimum at the local energy extremums that correspond to the image edges in case of image gradient.

The parameter criteria.epsilon is used to define the minimal number of points that must be moved during any iteration to keep the iteration process running.

If at some iteration the number of moved points is less than criteria.epsilon or the function performed criteria.max_iter iterations, the function terminates.

Optical Flow

CalcOpticalFlowHS

Calculates optical flow for two images

```
void cvCalcOpticalFlowHS( const CvArr* prev, const CvArr* curr, int use_previous,
                          CvArr* velx, CvArr* vely, double lambda,
                           CvTermCriteria criteria );
prev
     First image, 8-bit, single-channel.
curr
     Second image, 8-bit, single-channel.
use previous
    Uses previous (input) velocity field.
velx
     Horizontal component of the optical flow of the same size as input images, 32-bit floating-
    point, single-channel.
velv
    Vertical component of the optical flow of the same size as input images, 32-bit floating-
    point, single-channel.
lambda
    Lagrangian multiplier.
criteria
    Criteria of termination of velocity computing.
```

The function cvCalcOpticalFlowHS computes flow for every pixel of the first input image using Horn & Schunck algorithm [Horn81].

CalcOpticalFlowLK

Horizontal component of the optical flow of the same size as input images, 32-bit floating-point, single-channel.

vely

Vertical component of the optical flow of the same size as input images, 32-bit floating-point, single-channel.

The function cvCalcOpticalFlowLK computes flow for every pixel of the first input image using Lucas & Kanade algorithm [Lucas81].

CalcOpticalFlowBM

```
Calculates optical flow for two images by block matching method
```

```
void cvCalcOpticalFlowBM( const CvArr* prev, const CvArr* curr, CvSize block size,
                          CvSize shift size, CvSize max range, int use previous,
                          CvArr* velx, CvArr* vely );
prev
    First image, 8-bit, single-channel.
curr
     Second image, 8-bit, single-channel.
block size
     Size of basic blocks that are compared.
shift_size
     Block coordinate increments.
max_range
     Size of the scanned neighborhood in pixels around block.
use previous
    Uses previous (input) velocity field.
velx
     Horizontal component of the optical flow of
     floor((prev->width - block_size.width)/shiftSize.width) x floor((prev->height - block_size.
    height)/shiftSize.height) size, 32-bit floating-point, single-channel.
vely
    Vertical component of the optical flow of the same size velx, 32-bit floating-point,
```

The function cvCalcOpticalFlowBM calculates optical flow for overlapped blocks block_size.

single-channel.

width×block_size.height pixels each, thus the velocity fields are smaller than the original images. For every block in prev the functions tries to find a similar block in curr in some neighborhood of the original block or shifted by (velx(x0,y0),vely(x0,y0)) block as has been calculated by previous function call (if use_previous=1)

CalcOpticalFlowPyrLK

Calculates optical flow for a sparse feature set using iterative Lucas-Kanade method in pyramids

void cvCalcOpticalFlowPyrLK(const CvArr* prev, const CvArr* curr, CvArr* prev_pyr, CvArr*
curr_pyr,

const CvPoint2D32f* prev_features, CvPoint2D32f* curr_features,
int count, CvSize win_size, int level, char* status,
float* track_error, CvTermCriteria criteria, int flags);

prev

First frame, at time t.

curr

Second frame, at time t + dt .

prev_pyr

Buffer for the pyramid for the first frame. If the pointer is not NULL, the buffer must have a sufficient size to store the pyramid from level 1 to level #level; the total size of (image_width+8)*image_height/3 bytes is sufficient.

curr_pyr

Similar to prev_pyr, used for the second frame.

prev_features

Array of points for which the flow needs to be found.

curr_features

Array of 2D points containing calculated new positions of input features

in the second image.

count

Number of feature points.

win_size

Size of the search window of each pyramid level.

level

Maximal pyramid level number. If 0 , pyramids are not used (single level), if 1 , two levels are used, etc.

status

Array. Every element of the array is set to 1 if the flow for the corresponding feature has been found, 0 otherwise.

error

Array of double numbers containing difference between patches around the original and moved points. Optional parameter; can be NULL .

criteria

Specifies when the iteration process of finding the flow for each point on each pyramid level should be stopped.

flags

Miscellaneous flags:

- o CV_LKFLOW_PYR_A_READY , pyramid for the first frame is precalculated before the call;
- o CV_LKFLOW_PYR_B_READY , pyramid for the second frame is precalculated before the call;
- o CV_LKFLOW_INITIAL_GUESSES , array B contains initial coordinates of features before the function call.

The function cvCalcOpticalFlowPyrLK implements sparse iterative version of Lucas-Kanade optical flow in pyramids ([Bouguet00]). It calculates coordinates of the feature points on the current video frame given their coordinates on the previous frame. The function finds the coordinates with sub-pixel accuracy.

Both parameters prev_pyr and curr_pyr comply with the following rules: if the image pointer is 0, the function allocates the buffer internally, calculates the pyramid, and releases the buffer after processing. Otherwise, the function calculates the pyramid and stores it in the buffer unless the flag CV_LKFLOW_PYR_A[B]_READY is set. The image should be large enough to fit the Gaussian pyramid data. After the function call both pyramids are calculated and the readiness flag for the corresponding image can be set in the next call (i.e., typically, for all the image pairs except the very first one CV_LKFLOW_PYR_A_READY is set).

Estimators

CvKalman

Kalman filter state

```
typedef struct CvKalman
                                /* number of measurement vector dimensions */
    int MP;
    int DP;
                                /* number of state vector dimensions */
                                /* number of control vector dimensions */
    int CP;
    /* backward compatibility fields */
#if 1
                               /* =state pre->data.fl */
    float* PosterState;
                               /* =state_post->data.fl */
    float* PriorState;
                                /* =transition matrix->data.fl */
    float* DynamMatr;
                                /* =measurement matrix->data.fl */
    float* MeasurementMatr;
    float* MNCovariance;
                                /* =measurement_noise_cov->data.fl */
    float* PNCovariance;
                                /* =process noise cov->data.fl */
                                /* =qain->data.fl */
    float* KalmGainMatr;
    float* PriorErrorCovariance;/* =error cov pre->data.fl */
    float* PosterErrorCovariance;/* =error cov post->data.fl */
    float* Temp1;
                                /* temp1->data.fl */
    float* Temp2;
                                /* temp2->data.fl */
#endif
    CvMat* state_pre;
                                /* predicted state (x'(k)):
                                    x(k)=A*x(k-1)+B*u(k) */
    CvMat* state post;
                                /* corrected state (x(k)):
                                    x(k)=x'(k)+K(k)*(z(k)-H*x'(k))*/
                                /* state transition matrix (A) */
    CvMat* transition_matrix;
    CvMat* control matrix;
                                /* control matrix (B)
                                   (it is not used if there is no control)*/
    CvMat* measurement_matrix; /* measurement matrix (H) */
    CvMat* process noise cov;
                                /* process noise covariance matrix (0) */
    CvMat* measurement noise cov; /* measurement noise covariance matrix (R) */
    CvMat* error cov pre;
                                /* priori error estimate covariance matrix (P'(k)):
                                    P'(k) = A*P(k-1)*At + O)*/
    CvMat* qain;
                                /* Kalman gain matrix (K(k)):
                                    K(k)=P'(k)*Ht*inv(H*P'(k)*Ht+R)*/
    CvMat* error_cov_post;
                                /* posteriori error estimate covariance matrix (P(k)):
                                    P(k) = (I - K(k) * H) * P'(k) * /
    CvMat* temp1;
                                /* temporary matrices */
```

```
CvMat* temp2;
CvMat* temp3;
CvMat* temp4;
CvMat* temp5;
}
CvKalman;
```

The structure CvKalman is used to keep Kalman filter state. It is created by cvCreateKalman function, updated by cvKalmanCorrect functions and released by cvReleaseKalman functions. Normally, the structure is used for standard Kalman filter (notation and the formulae below are borrowed from the excellent Kalman tutorial [Welch95]):

```
\begin{split} &x_k = A \bullet x_{k-1} + B \bullet u_k + w_k \\ &z_k = H \bullet x_k + v_k, \end{split} where:  \begin{aligned} &x_k & (x_{k-1}) &- \text{ state of the system at the moment } k & (k-1) \\ &z_k &- \text{ measurement of the system state at the moment } k \\ &u_k &- \text{ external control applied at the moment } k \end{aligned}  \begin{aligned} &w_k &\text{ and } v_k &\text{ are normally-distributed process and measurement noise, respectively:} \\ &p(w) &\sim N(0,Q) \\ &p(v) &\sim N(0,R), \end{aligned} that is,  Q &- \text{ process noise covariance matrix, constant or variable,} \\ &R &- \text{ measurement noise covariance matrix, constant or variable} \end{aligned}
```

In case of standard Kalman filter, all the matrices: A, B, H, Q and R are initialized once after <u>CvKalman</u> structure is allocated via <u>cvCreateKalman</u>. However, the same structure and the same functions may be used to simulate extended Kalman filter by linearizing extended Kalman filter equation in the current system state neighborhood, in this case A, B, H (and, probably, Q and R) should be updated on every step.

CreateKalman

```
Allocates Kalman filter structure
```

ReleaseKalman

somehow.

KalmanPredict

```
Estimates subsequent model state

const CvMat* cvKalmanPredict( CvKalman* kalman, const CvMat* control=NULL );

#define cvKalmanUpdateByTime cvKalmanPredict
```

kalman

Kalman filter state.

control

Control vector (u_k) , should be NULL iff there is no external control (control_params=0).

The function cvKalmanPredict estimates the subsequent stochastic model state by its current state and stores it at kalman->state_pre:

```
 \begin{array}{c} x'_k = A \bullet x_k + B \bullet u_k \\ P'_k = A \bullet P_{k-1} ^*A^T + Q, \end{array} \\ \text{where} \\ x'_k \text{ is predicted state (kalman->state_pre),} \\ x_{k-1} \text{ is corrected state on the previous step (kalman->state_post)} \\ \text{ (should be initialized somehow in the beginning, zero vector by default),} \\ u_k \text{ is external control (control parameter),} \\ P'_k \text{ is priori error covariance matrix (kalman->error_cov_pre)} \\ P_{k-1} \text{ is posteriori error covariance matrix on the previous step (kalman->error_cov_post)} \\ \text{ (should be initialized somehow in the beginning, identity matrix by default),} \\ \end{array}
```

The function returns the estimated state.

KalmanCorrect

Adjusts model state

const CvMat* cvKalmanCorrect(CvKalman* kalman, const CvMat* measurement);
#define cvKalmanUpdateByMeasurement cvKalmanCorrect

kalman

Pointer to the structure to be updated. measurement

Pointer to the structure CvMat containing the measurement vector.

The function cvKalmanCorrect adjusts stochastic model state on the basis of the given

where

```
measurement of the model state:
K_k = P'_k \cdot H^T \cdot (H \cdot P'_k \cdot H^T + R)^{-1}
x_k = x'_k + K_k \bullet (z_k - H \bullet x'_k)
P_{\nu} = (I - K_{\nu} \cdot H) \cdot P'_{\nu}
```

K_k - Kalman "gain" matrix.

The function stores adjusted state at kalman->state_post and returns it on output.

Example. Using Kalman filter to track a rotating point

z_k - given measurement (mesurement parameter)

```
#include "cv.h"
#include "highqui.h"
#include <math.h>
int main(int argc, char** argv)
    /* A matrix data */
    const float A[] = \{ 1, 1, 0, 1 \};
    IplImage* img = cvCreateImage( cvSize(500,500), 8, 3 );
    CvKalman* kalman = cvCreateKalman( 2, 1, 0 );
    /* state is (phi, delta_phi) - angle and angle increment */
    CvMat* state = cvCreateMat( 2, 1, CV_32FC1 );
    CvMat* process_noise = cvCreateMat( 2, 1, CV_32FC1 );
    /* only phi (angle) is measured */
    CvMat* measurement = cvCreateMat( 1, 1, CV_32FC1 );
    CvRandState rng;
    int code = -1;
    cvRandInit(&rng, 0, 1, -1, CV_RAND_UNI);
    cvZero( measurement );
    cvNamedWindow( "Kalman", 1 );
```

```
for(;;)
   cvRandSetRange(&rng, 0, 0.1, 0);
   rnq.disttype = CV_RAND_NORMAL;
    cvRand( &rnq, state );
   memcpy( kalman->transition matrix->data.fl, A, sizeof(A));
   cvSetIdentity( kalman->measurement matrix, cvRealScalar(1) );
   cvSetIdentity( kalman->process noise cov, cvRealScalar(1e-5) );
   cvSetIdentity( kalman->measurement noise cov, cvRealScalar(1e-1) );
   cvSetIdentity( kalman->error cov post, cvRealScalar(1));
    /* choose random initial state */
   cvRand( &rnq, kalman->state post );
   rng.disttype = CV RAND NORMAL;
   for(;;)
        #define calc_point(angle)
            cvPoint( cvRound(imq->width/2 + imq->width/3*cos(angle)),
                     cvRound(img->height/2 - img->width/3*sin(angle)))
       float state angle = state->data.fl[0];
       CvPoint state pt = calc point(state angle);
        /* predict point position */
        const CvMat* prediction = cvKalmanPredict( kalman, 0 );
       float predict_angle = prediction->data.fl[0];
       CvPoint predict_pt = calc_point(predict_angle);
       float measurement angle;
       CvPoint measurement_pt;
        cvRandSetRange(&rng, 0, sqrt(kalman->measurement noise cov->data.fl[0]), 0);
        cvRand( &rng, measurement );
        /* generate measurement */
```

```
cvMatMulAdd( kalman->measurement matrix, state, measurement, measurement );
       measurement angle = measurement->data.fl[0];
       measurement pt = calc point(measurement angle);
        /* plot points */
        #define draw cross( center, color, d )
            cvLine( img, cvPoint( center.x - d, center.y - d ),
                         cvPoint( center.x + d, center.y + d ), color, 1, 0 ); \
            cvLine( img, cvPoint( center.x + d, center.y - d ),
                         cvPoint( center.x - d, center.y + d ), color, 1, 0 )
        cvZero( img );
        draw_cross( state_pt, CV_RGB(255,255,255), 3 );
        draw cross (measurement pt, CV RGB(255,0,0), 3);
        draw_cross( predict_pt, CV_RGB(0,255,0), 3 );
        cvLine( img, state_pt, predict_pt, CV_RGB(255,255,0), 3, 0 );
        /* adjust Kalman filter state */
        cvKalmanCorrect( kalman, measurement );
        cvRandSetRange( &rng, 0, sqrt(kalman->process noise cov->data.fl[0]), 0 );
        cvRand( &rng, process_noise );
        cvMatMulAdd( kalman->transition_matrix, state, process_noise, state );
        cvShowImage( "Kalman", img );
        code = cvWaitKey( 100 );
        if (code > 0) /* break current simulation by pressing a key */
            break;
   if( code == 27 ) /* exit by ESCAPE */
        break;
return 0;
```

CvConDensation

ConDenstation state

```
typedef struct CvConDensation
               //Dimension of measurement vector
    int MP;
    int DP;
               // Dimension of state vector
   float* DynamMatr;
                       // Matrix of the linear Dynamics system
    float* State;
                          // Vector of State
   int SamplesNum;
                         // Number of the Samples
   float** flSamples; // array of the Sample Vectors
   float** flNewSamples;
                           // temporary array of the Sample Vectors
    float* flConfidence;
                           // Confidence for each Sample
    float* flCumulative;
                           // Cumulative confidence
   float* Temp;
                           // Temporary vector
   float* RandomSample;
                           // RandomVector to update sample set
    CvRandState* RandS;
                           // Array of structures to generate random vectors
} CvConDensation;
```

The structure <u>CvConDensation</u> stores CONditional DENSity propagATION tracker state. The information about the algorithm can be found at http://www.dai.ed.ac.uk/CVonline/LOCAL_COPIES/ISARD1/condensation.html

CreateConDensation

```
Allocates ConDensation filter structure
```

 ${\tt CvConDensation*} \ \, {\tt cvCreateConDensation(int dynam_params, int measure_params, int sample_count);}$

```
dynam_params
Dimension of the state vector.
measure_params
Dimension of the measurement vector.
sample_count
Number of samples.
```

The function cvCreateConDensation creates CvConDensation structure and returns pointer to the structure.

ReleaseConDensation

Deallocates ConDensation filter structure

```
void cvReleaseConDensation( CvConDensation** condens );
```

condens

Pointer to the pointer to the structure to be released.

The function cvReleaseConDensation releases the structure <u>CvConDensation</u> (see <u>cvConDensation</u>) and frees all memory previously allocated for the structure.

ConDensInitSampleSet

Initializes sample set for ConDensation algorithm

void cvConDensInitSampleSet(CvConDensation* condens, CvMat* lower_bound, CvMat* upper_bound);

condens

Pointer to a structure to be initialized.

lower bound

Vector of the lower boundary for each dimension.

upper bound

Vector of the upper boundary for each dimension.

The function cvConDensInitSampleSet fills the samples arrays in the structure <u>CvConDensation</u> with values within specified ranges.

ConDensUpdateByTime

Estimates subsequent model state

void cvConDensUpdateByTime(CvConDensation* condens);

condens

Pointer to the structure to be updated.

The function cvConDensUpdateByTime estimates the subsequent stochastic model state from its current state.

Pattern Recognition

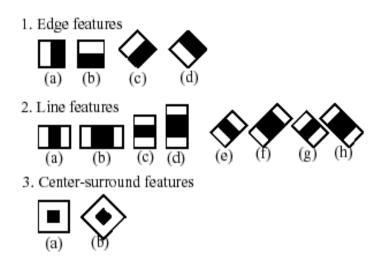
Object Detection

The object detector described below has been initially proposed by Paul Viola [Viola01] and improved by Rainer Lienhart [Lienhart02]. First, a classifier (namely a cascade of boosted classifiers working with haar-like features) is trained with a few hundreds of sample views of a particular object (i.e., a face or a car), called positive examples, that are scaled to the same size (say, 20x20), and negative examples - arbitrary images of the same size.

After a classifier is trained, it can be applied to a region of interest (of the same size as used during the training) in an input image. The classifier outputs a "1" if the region is likely to show the object (i.e., face/car), and "0" otherwise. To search for the object in the whole image one can move the search window across the image and check every location using the classifier. The classifier is designed so that it can be easily "resized" in order to be able to find the objects of interest at different sizes, which is more efficient than resizing the image itself. So, to find an object of an unknown size in the image the scan procedure should be done several times at different scales.

The word "cascade" in the classifier name means that the resultant classifier consists of several simpler classifiers (stages) that are applied subsequently to a region of interest until at some stage the candidate is rejected or all the stages are passed. The word "boosted" means that the classifiers at every stage of the cascade are complex themselves and they are

built out of basic classifiers using one of four different boosting techniques (weighted voting). Currently Discrete Adaboost, Real Adaboost, Gentle Adaboost and Logitboost are supported. The basic classifiers are decision-tree classifiers with at least 2 leaves. Haarlike features are the input to the basic classifiers, and are calculated as described below. The current algorithm uses the following Haar-like features:



The feature used in a particular classifier is specified by its shape (1a, 2b etc.), position within the region of interest and the scale (this scale is not the same as the scale used at the detection stage, though these two scales are multiplied). For example, in case of the third line feature (2c) the response is calculated as the difference between the sum of image pixels under the rectangle covering the whole feature (including the two white stripes and the black stripe in the middle) and the sum of the image pixels under the black stripe multiplied by 3 in order to compensate for the differences in the size of areas. The sums of pixel values over a rectangular regions are calculated rapidly using integral images (see below and cvIntegral description).

To see the object detector at work, have a look at HaarFaceDetect demo.

The following reference is for the detection part only. There is a separate application called haartraining that can train a cascade of boosted classifiers from a set of samples. See opency/apps/haartraining for details.

CvHaarFeature, CvHaarClassifier, CvHaarStageClassifier, CvHaarClassifierCascade

Boosted Haar classifier structures

```
#define CV HAAR FEATURE MAX 3
/* a haar feature consists of 2-3 rectangles with appropriate weights */
typedef struct CvHaarFeature
   int tilted; /* 0 means up-right feature, 1 means 45--rotated feature */
   /* 2-3 rectangles with weights of opposite signs and
       with absolute values inversely proportional to the areas of the rectangles.
       if rect[2].weight !=0, then
       the feature consists of 3 rectangles, otherwise it consists of 2 */
    struct
        CvRect r;
       float weight;
    } rect[CV HAAR FEATURE MAX];
CvHaarFeature;
/* a single tree classifier (stump in the simplest case) that returns the response for the
feature
  at the particular image location (i.e. pixel sum over subrectangles of the window) and gives
out
  a value depending on the responce */
typedef struct CvHaarClassifier
   int count; /* number of nodes in the decision tree */
   /* these are "parallel" arrays. Every index i
       corresponds to a node of the decision tree (root has 0-th index).
       left[i] - index of the left child (or negated index if the left child is a leaf)
       right[i] - index of the right child (or negated index if the right child is a leaf)
       threshold[i] - branch threshold. if feature responce is <= threshold, left branch
                      is chosen, otherwise right branch is chosed.
```

```
alpha[i] - output value correponding to the leaf. */
   CvHaarFeature* haar feature;
    float* threshold;
    int* left;
   int* right;
   float* alpha;
CvHaarClassifier;
/* a boosted battery of classifiers(=stage classifier):
  the stage classifier returns 1
  if the sum of the classifiers' responces
  is greater than threshold and 0 otherwise */
typedef struct CvHaarStageClassifier
   int count; /* number of classifiers in the battery */
    float threshold; /* threshold for the boosted classifier */
   CvHaarClassifier* classifier; /* array of classifiers */
   /* these fields are used for organizing trees of stage classifiers,
      rather than just stright cascades */
    int next;
   int child;
   int parent;
CvHaarStageClassifier;
typedef struct CvHidHaarClassifierCascade CvHidHaarClassifierCascade;
/* cascade or tree of stage classifiers */
typedef struct CvHaarClassifierCascade
   int flags; /* signature */
   int count; /* number of stages */
   CvSize orig window size; /* original object size (the cascade is trained for) */
   /* these two parameters are set by cvSetImagesForHaarClassifierCascade */
   CvSize real window size; /* current object size */
```

```
double scale; /* current scale */
    CvHaarStageClassifier* stage_classifier; /* array of stage classifiers */
    CvHidHaarClassifierCascade* hid cascade; /* hidden optimized representation of the cascade,
                                                         created by cvSetImagesForHaarClassifierCascade
* /
CvHaarClassifierCascade;
All the structures are used for representing a cascaded of boosted Haar classifiers. The
cascade has the following hierarchical structure:
     Cascade:
         Stage<sub>1</sub>:
              Classifier<sub>11</sub>:
                   Feature<sub>11</sub>
              Classifier<sub>12</sub>:
                   Feature<sub>12</sub>
         Stage<sub>2</sub>:
              Classifier<sub>21</sub>:
                   Feature<sub>21</sub>
```

The whole hierarchy can be constructed manually or loaded from a file or an embedded base using function cvLoadHaarClassifierCascade.

cvLoadHaarClassifierCascade

Loads a trained cascade classifier from file or the classifier database embedded in OpenCV

CvHaarClassifierCascade* cvLoadHaarClassifierCascade(

```
const char* directory,
CvSize orig_window_size );
```

directory

Name of directory containing the description of a trained cascade classifier. $\mbox{orig_window_size}$

Original size of objects the cascade has been trained on. Note that it is not stored in the cascade and therefore must be specified separately.

The function cvLoadHaarClassifierCascade loads a trained cascade of haar classifiers from a file or the classifier database embedded in OpenCV. The base can be trained using haartraining application (see opency/apps/haartraining for details).

The function is obsolete. Nowadays object detection classifiers are stored in XML or YAML files, rather than in directories. To load cascade from a file, use cvload function.

cvReleaseHaarClassifierCascade

Releases haar classifier cascade

void cvReleaseHaarClassifierCascade(CvHaarClassifierCascade** cascade);

cascade

Double pointer to the released cascade. The pointer is cleared by the function.

The function cvReleaseHaarClassifierCascade deallocates the cascade that has been created manually or loaded using cvLoadHaarClassifierCascade or cvLoad.

cvHaarDetectObjects

```
Detects objects in the image

typedef struct CvAvgComp
{
    CvRect rect; /* bounding rectangle for the object (average rectangle of a group) */
```

```
int neighbors; /* number of neighbor rectangles in the group */
CvAvqComp;
CvSeq* cvHaarDetectObjects( const CvArr* image, CvHaarClassifierCascade* cascade,
                            CvMemStorage* storage, double scale factor=1.1,
                            int min_neighbors=3, int flags=0,
                            CvSize min size=cvSize(0,0));
image
    Image to detect objects in.
cascade
    Haar classifier cascade in internal representation.
storage
    Memory storage to store the resultant sequence of the object candidate rectangles.
scale factor
    The factor by which the search window is scaled between the subsequent scans, for example,
    1.1 means increasing window by 10%.
min neighbors
    Minimum number (minus 1) of neighbor rectangles that makes up an object. All the groups of
    a smaller number of rectangles than min neighbors-1 are rejected. If min neighbors is 0,
    the function does not any grouping at all and returns all the detected candidate
    rectangles, which may be useful if the user wants to apply a customized grouping
    procedure.
flags
    Mode of operation. Currently the only flag that may be specified is
    CV_HAAR_DO_CANNY_PRUNING. If it is set, the function uses Canny edge detector to reject
    some image regions that contain too few or too much edges and thus can not contain the
    searched object. The particular threshold values are tuned for face detection and in this
    case the pruning speeds up the processing.
min_size
    Minimum window size. By default, it is set to the size of samples the classifier has been
    trained on (~20×20 for face detection).
```

The function cvHaarDetectObjects finds rectangular regions in the given image that are likely to contain objects the cascade has been trained for and returns those regions as a sequence of rectangles. The function scans the image several times at different scales (see cvSetImagesForHaarClassifierCascade). Each time it considers overlapping regions in the image

and applies the classifiers to the regions using cvRunHaarClassifierCascade. It may also apply

some heuristics to reduce number of analyzed regions, such as Canny prunning. After it has proceeded and collected the candidate rectangles (regions that passed the classifier cascade), it groups them and returns a sequence of average rectangles for each large enough group. The default parameters (scale_factor=1.1, min_neighbors=3, flags=0) are tuned for accurate yet slow object detection. For a faster operation on real video images the settings are: scale_factor=1.2, min_neighbors=2, flags=CV_HAAR_DO_CANNY_PRUNING, min_size=<minimum possible face size> (for example, ~1/4 to 1/16 of the image area in case of video conferencing).

Example. Using cascade of Haar classifiers to find objects (e.g. faces).

```
#include "cv.h"
#include "highqui.h"
CvHaarClassifierCascade* load object detector( const char* cascade path )
    return (CvHaarClassifierCascade*)cvLoad( cascade path );
void detect_and_draw_objects( IplImage* image,
                              CvHaarClassifierCascade* cascade,
                              int do_pyramids )
    IplImage* small image = image;
    CvMemStorage* storage = cvCreateMemStorage(0);
    CvSeq* faces;
    int i, scale = 1;
    /* if the flag is specified, down-scale the input image to get a
       performance boost w/o loosing quality (perhaps) */
    if ( do pyramids )
        small image = cvCreateImage( cvSize(image->width/2,image->height/2), IPL DEPTH 8U, 3 );
        cvPyrDown( image, small image, CV GAUSSIAN 5x5 );
        scale = 2;
    /* use the fastest variant */
    faces = cvHaarDetectObjects( small_image, cascade, storage, 1.2, 2,
```

```
CV HAAR DO CANNY PRUNING );
    /* draw all the rectangles */
    for( i = 0; i < faces->total; i++ )
        /* extract the rectanlges only */
        CvRect face rect = *(CvRect*)cvGetSeqElem( faces, i, 0 );
        cvRectangle( image, cvPoint(face_rect.x*scale,face_rect.y*scale),
                     cvPoint((face rect.x+face rect.width)*scale,
                             (face rect.y+face rect.height)*scale),
                     CV RGB(255,0,0), 3);
    if( small_image != image )
        cvReleaseImage( &small image );
    cvReleaseMemStorage( &storage );
/* takes image filename and cascade path from the command line */
int main( int argc, char** argv )
    IplImage* image;
    if( argc==3 && (image = cvLoadImage( argv[1], 1 )) != 0 )
        CvHaarClassifierCascade* cascade = load object detector(arqv[2]);
        detect_and_draw_objects( image, cascade, 1 );
        cvNamedWindow( "test", 0 );
        cvShowImage( "test", image );
        cvWaitKey(0);
        cvReleaseHaarClassifierCascade( &cascade );
        cvReleaseImage( &image );
    return 0;
```

cvSetImagesForHaarClassifierCascade

Assigns images to the hidden cascade

cascade

Hidden Haar classifier cascade, created by cvcreateHidHaarClassifierCascade.

sum

Integral (sum) single-channel image of 32-bit integer format. This image as well as the two subsequent images are used for fast feature evaluation and brightness/contrast normalization. They all can be retrieved from input 8-bit or floating point single-channel image using The function cvIntegral.

sqsum

Square sum single-channel image of 64-bit floating-point format.

Tilted sum single-channel image of 32-bit integer format.

scale

Window scale for the cascade. If scale=1, original window size is used (objects of that size are searched) - the same size as specified in cvLoadHaarClassifierCascade (24x24 in case of "<default_face_cascade>"), if scale=2, a two times larger window is used (48x48 in case of default face cascade). While this will speed-up search about four times, faces smaller than 48x48 cannot be detected.

The function cvSetImagesForHaarClassifierCascade assigns images and/or window scale to the hidden classifier cascade. If image pointers are NULL, the previously set images are used further (i.e. NULLs mean "do not change images"). Scale parameter has no such a "protection" value, but the previous value can be retrieved by cvGetHaarClassifierCascadeScale function and reused again. The function is used to prepare cascade for detecting object of the particular size in the particular image. The function is called internally by cvHaarDetectObjects, but it can be called by user if there is a need in using lower-level function cvRunHaarClassifierCascade.

cvRunHaarClassifierCascade

Runs cascade of boosted classifier at given image location

cascade

Haar classifier cascade.

pt

Top-left corner of the analyzed region. Size of the region is a original window size scaled by the currenly set scale. The current window size may be retrieved using cvGetHaarClassifierCascadeWindowSize function.

start_stage

Initial zero-based index of the cascade stage to start from. The function assumes that all the previous stages are passed. This feature is used internally by cvHaarDetectObjects for better processor cache utilization.

The function cvRunHaarHaarClassifierCascade runs Haar classifier cascade at a single image location. Before using this function the integral images and the appropriate scale (=> window size) should be set using cvSetImagesForHaarClassifierCascade. The function returns positive value if the analyzed rectangle passed all the classifier stages (it is a candidate) and zero or negative value otherwise.

Camera Calibration and 3D Reconstruction

Pinhole Camera Model, Distortion

The functions in this section use so-called pinhole camera model. That is, a scene view is formed by projecting 3D points into the image plane using perspective transformation.

```
s*m' = A*[R|t]*M', or
[u] [fx 0 cx] [r_{11} r_{12} r_{13} t_1] [X]
s[v] = [0 fy cy]*[r_{21} r_{22} r_{23} t_2]*[Y]
```

[1]
$$[0 \ 0 \ 1] [r_{31} r_{32} r_{33} t_2] [Z]$$

Where (X, Y, Z) are coordinates of a 3D point in the world coordinate space, (u, v) are coordinates of point projection in pixels. A is called a camera matrix, or matrix of intrinsic parameters. (cx, cy) is a principal point (that is usually at the image center), and fx, fy are focal lengths expressed in pixel-related units. Thus, if an image from camera is up-sampled/down-sampled by some factor, all these parameters (fx, fy, cx and cy) should be scaled (multiplied/divided, respectively) by the same factor. The matrix of intrinsic parameters does not depend on the scene viewed and, once estimated, can be re-used (as long as the focal length is fixed (in case of zoom lens)). The joint rotation-translation matrix [R|t] is called a matrix of extrinsic parameters. It is used to describe the camera motion around a static scene, or vice versa, rigid motion of an object in front of still camera. That is, [R|t] translates coordinates of a point (X, Y, Z) to some coordinate system, fixed with respect to the camera. The transformation above is equivalent to the following (when $z \neq 0$):

Real lens usually have some distortion, which major components are radial distorion and slight tangential distortion. So, the above model is extended as:

[x] [X]
[y] = R*[Y] + t
[z] [Z]

$$x' = x/z$$
 $y' = y/z$
 $x'' = x'*(1 + k_1r^2 + k_2r^4) + 2*p_1x'*y' + p_2(r^2+2*x'^2)$

```
y'' = y'*(1 + k_1r^2 + k_2r^4) + p_1(r^2+2*y'^2) + 2*p_2*x'*y' where r^2 = x'^2+y'^2 u = fx*x'' + cx v = fy*y'' + cy
```

 k_1 , k_2 are radial distortion coefficients, p_1 , p_2 are tangential distortion coefficients. Higher-order coefficients are not considered in OpenCV. The distortion coefficients also do not depend on the scene viewed, thus they are intrinsic camera parameters. And they remain the same regardless of the captured image resolution.

The functions below use the above model to

- Project 3D points to the image plane given intrinsic and extrinsic parameters
- Compute extrinsic parameters given intrinsic parameters, a few 3D points and their projections.
- Estimate intrinsic and extrinsic camera parameters from several views of a known calibration pattern (i.e. every view is described by several 3D-2D point correspondences).

Camera Calibration

ProjectPoints2

Projects 3D points to image plane

object points

The array of object points, 3xN or Nx3, where N is the number of points in the view.

rotation_vector

The rotation vector, 1x3 or 3x1.

translation_vector

The translation vector, 1x3 or 3x1.

intrinsic_matrix

The camera matrix (A) [fx 0 cx; 0 fy cy; 0 0 1].

distortion_coeffs

The vector of distortion coefficients, 4x1 or 1x4 $[k_1, k_2, p_1, p_2]$. If it is NULL, all

distortion coefficients are considered 0's.

image_points

The output array of image points, 2xN or Nx2, where N is the total number of points in the view.

dpdrot

Optional Nx3 matrix of derivatives of image points with respect to components of the rotation vector.

dpdt

Optional Nx3 matrix of derivatives of image points w.r.t. components of the translation vector.

dpdf

Optional Nx2 matrix of derivatives of image points w.r.t. fx and fy.

dpdc

Optional Nx2 matrix of derivatives of image points w.r.t. cx and cy. dpddist

Optional Nx4 matrix of derivatives of image points w.r.t. distortion coefficients.

The function cvProjectPoints2 computes projections of 3D points to the image plane given intrinsic and extrinsic camera parameters. Optionally, the function computes jacobians - matrices of partial derivatives of image points as functions of all the input parameters w.r.t. the particular parameters, intrinsic and/or extrinsic. The jacobians are used during the global optimization in cvCalibrateCamera2 and cvFindExtrinsicCameraParams2. The function itself is also used to compute back-projection error for with current intrinsic and extrinsic parameters.

Note, that with intrinsic and/or extrinsic parameters set to special values, the function can be used to compute just extrinsic transformation or just intrinsic transformation (i.e. distortion of a sparse set of points).

FindHomography

Finds perspective transformation between two planes

src_points

Point coordinates in the original plane, 2xN, Nx2, 3xN or Nx3 array (the latter two are for representation in homogenious coordinates), where N is the number of points.

Point coordinates in the destination plane, 2xN, Nx2, 3xN or Nx3 array (the latter two are for representation in homogenious coordinates)

homography

Output 3x3 homography matrix.

The function cvFindHomography finds perspective transformation H=||hij|| between the source and the destination planes:

$$[x'_{i}]$$
 $[x_{i}]$
 $s_{i}[y'_{i}] \sim H^{*}[y_{i}]$
 $[1]$ $[1]$

So that the back-projection error is minimized:

The function is used to find initial intrinsic and extrinsic matrices. Homography matrix is determined up to a scale, thus it is normalized to make h33=1.

CalibrateCamera2

Finds intrinsic and extrinsic camera parameters using calibration pattern

void cvCalibrateCamera2(const CvMat* object_points, const CvMat* image_points,

const CvMat* point_counts, CvSize image_size,
CvMat* intrinsic_matrix, CvMat* distortion_coeffs,
CvMat* rotation_vectors=NULL, CvMat* translation_vectors=NULL,
int flags=0);

object_points

The joint matrix of object points, 3xN or Nx3, where N is the total number of points in all views.

image_points

The joint matrix of corresponding image points, 2xN or Nx2, where N is the total number of points in all views.

point_counts

Vector containing numbers of points in each particular view, 1xM or Mx1, where M is the number of a scene views.

image_size

Size of the image, used only to initialize intrinsic camera matrix.

intrinsic_matrix

The output camera matrix (A) [fx 0 cx; 0 fy cy; 0 0 1]. If CV_CALIB_USE_INTRINSIC_GUESS and/or CV_CALIB_FIX_ASPECT_RATION are specified, some or all of fx, fy, cx, cy must be initialized.

distortion_coeffs

The output 4x1 or 1x4 vector of distortion coefficients $[k_1, k_2, p_1, p_2]$.

rotation vectors

The output 3xM or Mx3 array of rotation vectors (compact representation of rotation matrices, see $\underline{cvRodrigues2}$).

translation_vectors

The output 3xM or Mx3 array of translation vectors.

flags

Different flags, may be 0 or combination of the following values:

CV_CALIB_USE_INTRINSIC_GUESS - intrinsic_matrix contains valid initial values of fx, fy, cx, cy that are optimized further. Otherwise, (cx, cy) is initially set to the image center (image_size is used here), and focal distances are computed in some least-squares fashion. Note, that if intrinsic parameters are known, there is no need to use this function. Use cvFindExtrinsicCameraParams2 instead.

CV_CALIB_FIX_PRINCIPAL_POINT - The principal point is not changed during the global optimization, it stays at the center and at the other location specified (when CV_CALIB_USE_INTRINSIC_GUESS is set as well).

CV_CALIB_FIX_ASPECT_RATIO - The optimization procedure consider only one of fx and fy as independent variable and keeps the aspect ratio fx/fy the same as it was set initially in

intrinsic_matrix. In this case the actual initial values of (fx, fy) are either taken from the matrix (when CV_CALIB_USE_INTRINSIC_GUESS is set) or estimated somehow (in the latter case fx, fy may be set to arbitrary values, only their ratio is used).

CV_CALIB_ZERO_TANGENT_DIST - Tangential distortion coefficients are set to zeros and do not change during the optimization.

The function cvCalibrateCamera2 estimates intrinsic camera parameters and extrinsic parameters for each of the views. The coordinates of 3D object points and their correspondent 2D projections in each view must be specified. That may be achieved by using an object with known geometry and easily detectable feature points. Such an object is called calibration rig or calibration pattern, and OpenCV has built-in support for a chessboard as a calibration rig (see cvFindChessboardCornerGuesses). Currently, initialization of inrtrinsic parameters (when CV_CALIB_USE_INTRINSIC_GUESS is not set) is only implemented for planar calibration rigs (z-coordinates of object points must be all 0's or all 1's). 3D rigs can still be used as long as initial intrinsic_matrix is provided. After the initial values of intrinsic and extrinsic parameters are computed, they are optimized to minimize the total back-projection error - the sum of squared differences between the actual coordinates of image points and the ones computed using cvProjectPoints2.

FindExtrinsicCameraParams2

Finds extrinsic camera parameters for particular view

object_points

The array of object points, 3xN or Nx3, where N is the number of points in the view. image_points

The array of corresponding image points, 2xN or Nx2, where N is the number of points in the view.

intrinsic_matrix

The camera matrix (A) [fx 0 cx; 0 fy cy; 0 0 1].

```
distortion_coeffs
```

The vector of distortion coefficients, 4x1 or 1x4 $[k_1, k_2, p_1, p_2]$. If it is NULL, all distortion coefficients are considered 0's.

rotation vector

The output 3x1 or 1x3 rotation vector (compact representation of a rotation matrix, see cvRodrigues2).

translation vector

The output 3x1 or 1x3 translation vector.

The function cvFindExtrinsicCameraParams2 estimates extrinsic camera parameters using known intrinsic parameters and and extrinsic parameters for each view. The coordinates of 3D object points and their correspondent 2D projections must be specified. This function also minimizes back-projection error.

Rodrigues2

Converts rotation matrix to rotation vector or vice versa

```
int cvRodrigues2( const CvMat* src, CvMat* dst, CvMat* jacobian=0 );
```

src

The input rotation vector (3x1 or 1x3) or rotation matrix (3x3).

dst

The output rotation matrix (3x3) or rotation vector (3x1 or 1x3), respectively.

Optional output Jacobian matrix, 3x9 or 9x3 - partial derivatives of the output array components w.r.t the input array components.

The function cvRodrigues2 converts a rotation vector to rotation matrix or vice versa. Rotation vector is a compact representation of rotation matrix. Direction of the rotation vector is the rotation axis and the length of the vector is the rotation angle around the axis. The rotation matrix R, corresponding to the rotation vector r, is computed as following:

$$[0 - r_z r_y]$$

```
R = \cos(\text{theta})*I + (1-\cos(\text{theta}))*rr^T + \sin(\text{theta})*[r_z \ 0 \ -r_x] [r_v \ r_x \ 0]
```

Inverse transformation can also be done easily as

Rotation vector is a convenient representation of a rotation matrix as a matrix with only 3 degrees of freedom. The representation is used in the global optimization procedures inside cvFindExtrinsicCameraParams2 and cvCalibrateCamera2.

Undistort2

Transforms image to compensate lens distortion

The function cvUndistort2 transforms the image to compensate radial and tangential lens distortion. The camera matrix and distortion parameters can be determined using cvCalibrateCamera2. For every pixel in the output image the function computes coordinates of

the corresponding location in the input image using the formulae in the section beginning. Then, the pixel value is computed using bilinear interpolation. If the resolution of images is different from what was used at the calibration stage, fx, fy, cx and cy need to be adjusted appropriately, while the distortion coefficients remain the same.

InitUndistortMap

Computes undistorion map

The function cvInitUndistortMap pre-computes the undistortion map - coordinates of the corresponding pixel in the distorted image for every pixel in the corrected image. Then, the map (together with input and output images) can be passed to cvRemap function.

FindChessboardCorners

Finds positions of internal corners of the chessboard

image

Source chessboard view; it must be 8-bit grayscale or color image.

pattern_size

The number of inner corners per chessboard row and column.

corners

The output array of corners detected.

corner_count

The output corner counter. If it is not NULL, the function stores there the number of corners found.

flags

Various operation flags, can be 0 or a combination of the following values: CV_CALIB_CB_ADAPTIVE_THRESH - use adaptive thresholding to convert the image to black-n-white, rather than a fixed threshold level (computed from the average image brightness). CV_CALIB_CB_NORMALIZE_IMAGE - normalize the image using cvNormalizeHist before applying fixed or adaptive thresholding.

CV_CALIB_CB_FILTER_QUADS - use additional criteria (like contour area, perimeter, square-like shape) to filter out false quads that are extracted at the contour retrieval stage.

The function cvFindChessboardCorners attempts to determine whether the input image is a view of the chessboard pattern and locate internal chessboard corners. The function returns non-zero value if all the corners have been found and they have been placed in a certain order (row by row, left to right in every row), otherwise, if the function fails to find all the corners or reorder them, it returns 0. For example, a regular chessboard has 8 x 8 squares and 7 x 7 internal corners, that is, points, where the black squares touch each other. The coordinates detected are approximate, and to determine their position more accurately, the user may use the function cvFindCornerSubPix.

DrawChessBoardCorners

Renders the detected chessboard corners

image

The destination image; it must be 8-bit color image. pattern size

The number of inner corners per chessboard row and column.

The array of corners detected.

count

The number of corners.

pattern_was_found

Indicates whether the complete board was found $(\neq 0)$ or not (=0). One may just pass the return value cvFindChessboardCorners here.

The function cvDrawChessboardCorners draws the individual chessboard corners detected (as red circles) in case if the board was not found (pattern_was_found=0) or the colored corners connected with lines when the board was found (pattern_was_found≠0).

Pose Estimation

CreatePOSITObject

Initializes structure containing object information

CvPOSITObject* cvCreatePOSITObject(CvPoint3D32f* points, int point_count);

points

Pointer to the points of the 3D object model.

Number of object points.

The function cvCreatePOSITObject allocates memory for the object structure and computes the object inverse matrix.

The preprocessed object data is stored in the structure <u>CvPOSITObject</u>, internal for OpenCV, which means that the user cannot directly access the structure data. The user may only create this structure and pass its pointer to the function.

Object is defined as a set of points given in a coordinate system. The function cvPOSIT computes a vector that begins at a camera-related coordinate system center and ends at the points[0] of the object.

Once the work with a given object is finished, the function cvReleasePOSITObject must be called to free memory.

POSIT

```
Implements POSIT algorithm
void cvPOSIT( CvPOSITObject* posit object, CvPoint2D32f* image points, double focal length,
              CvTermCriteria criteria, CvMatr32f rotation matrix, CvVect32f
translation vector );
posit_object
     Pointer to the object structure.
image points
     Pointer to the object points projections on the 2D image plane.
focal length
     Focal length of the camera used.
criteria
     Termination criteria of the iterative POSIT algorithm.
rotation matrix
     Matrix of rotations.
translation_vector
     Translation vector.
```

The function cvPOSIT implements POSIT algorithm. Image coordinates are given in a camerarelated coordinate system. The focal length may be retrieved using camera calibration functions. At every iteration of the algorithm new perspective projection of estimated pose is computed.

Difference norm between two projections is the maximal distance between corresponding points. The parameter criteria.epsilon serves to stop the algorithm if the difference is small.

ReleasePOSITObject

Deallocates 3D object structure

The function cvReleasePOSITObject releases memory previously allocated by the function cvCreatePOSITObject.

CalcImageHomography

The function cvCalcImageHomography calculates the homography matrix for the initial image transformation from image plane to the plane, defined by 3D oblong object line (See <u>Figure 6-10</u> in OpenCV Guide 3D Reconstruction Chapter).

Epipolar Geometry

FindFundamentalMat

Calculates fundamental matrix from corresponding points in two images

points1

Array of the first image points of 2xN, Nx2, 3xN or Nx3 size (where N is number of points). Multi-channel 1xN or Nx1 array is also acceptable. The point coordinates should be floating-point (single or double precision)

points2

Array of the second image points of the same size and format as points1 fundamental_matrix

The output fundamental matrix or matrices. The size should be 3x3 or 9x3 (7-point method may return up to 3 matrices).

method

Method for computing the fundamental matrix CV_FM_7POINT - for 7-point algorithm. N == 7 CV_FM_8POINT - for 8-point algorithm. N >= 8 CV_FM_RANSAC - for RANSAC algorithm. N >= 8 CV_FM_LMEDS - for LMedS algorithm. N >= 8 param1

The parameter is used for RANSAC or LMedS methods only. It is the maximum distance from point to epipolar line in pixels, beyond which the point is considered an outlier and is not used for computing the final fundamental matrix. Usually it is set to 0.5 or 1.0.

The parameter is used for RANSAC or LMedS methods only. It denotes the desirable level of confidence that the matrix is correct.

status

The optional output array of N elements, every element of which is set to 0 for outliers and to 1 for the other points. The array is computed only in RANSAC and LMedS methods. For other methods it is set to all 1's.

The epipolar geometry is described by the following equation:

$$p_2^{T*}F*p_1=0$$
,

where F is fundamental matrix, p_1 and p_2 are corresponding points in the first and the second images, respectively.

The function cvFindFundamentalMat calculates fundamental matrix using one of four methods listed above and returns the number of fundamental matrices found (1 or 3) and 0, if no matrix is found.

The calculated fundamental matrix may be passed further to cvComputeCorrespondEpilines that finds epipolar lines corresponding to the specified points.

Example. Estimation of fundamental matrix using RANSAC algorithm

```
int point count = 100;
CvMat* points1;
CvMat* points2;
CvMat* status;
CvMat* fundamental matrix;
points1 = cvCreateMat(1,point_count,CV_32FC2);
points2 = cvCreateMat(1,point count,CV 32FC2);
status = cvCreateMat(1,point count,CV 8UC1);
/* Fill the points here ... */
for( i = 0; i < point count; i++ )</pre>
    points1->data.db[i*2] = \langle x_{1,i} \rangle;
    points1->data.db[i*2+1] = \langle y_{1,i} \rangle i
    points2->data.db[i*2] = < x_{2.i}>;
    points2->data.db[i*2+1] = \langle y_{2,i} \rangle i
fundamental_matrix = cvCreateMat(3,3,CV_32FC1);
int fm count = cvFindFundamentalMat( points1,points2,fundamental matrix,
                                          CV FM RANSAC, 1.0, 0.99, status );
```

ComputeCorrespondEpilines

For points in one image of stereo pair computes the corresponding epilines in the other image

points

The input points. 2xN, Nx2, 3xN or Nx3 array (where N number of points). Multi-channel 1xN or Nx1 array is also acceptable.

which_image

Index of the image (1 or 2) that contains the points fundamental matrix

Fundamental matrix

correspondent_lines

Computed epilines, 3xN or Nx3 array

For every point in one of the two images of stereo-pair the function cvComputeCorrespondEpilines finds equation of a line that contains the corresponding point (i. e. projection of the same 3D point) in the other image. Each line is encoded by a vector of 3 elements $l=[a,b,c]^T$, so that:

$$1^{T*}[x, y, 1]^{T}=0$$
, or $a*x + b*y + c = 0$

From the fundamental matrix definition (see $\underline{\text{cvFindFundamentalMatrix}}$ discussion), line l_2 for a point p_1 in the first image (which_image=1) can be computed as:

$$l_2 = F * p_1$$

and the line l_1 for a point p_2 in the second image (which_image=1) can be computed as:

$$l_1 = F^T * p_2$$

Line coefficients are defined up to a scale. They are normalized $(a^2+b^2=1)$ are stored into correspondent lines.

ConvertPointsHomogenious

Convert points to/from homogenious coordinates

void cvConvertPointsHomogenious(const CvMat* src, CvMat* dst);

src

The input point array, 2xN, Nx2, 3xN, Nx3, 4xN or Nx4 (where N is the number of points). Multi-channel 1xN or Nx1 array is also acceptable.

dst.

The output point array, must contain the same number of points as the input; The dimensionality must be the same, 1 less or 1 more than the input, and also within 2..4.

The function cvConvertPointsHomogenious converts 2D or 3D points from/to homogenious coordinates, or simply copies or transposes the array. In case if the input array dimensionality is larger than the output, each point coordinates are divided by the last coordinate:

```
(x,y[,z],w) \rightarrow (x',y'[,z']):

x' = x/w

y' = y/w

z' = z/w (if output is 3D)

If the output array dimensionality is larger, an extra 1 is appended to each point.
```

Otherwise, the input array is simply copied (with optional transposition) to the output. **Note** that, because the function accepts a large variety of array layouts, it may report an error when input/output array dimensionality is ambiguous. It is always safe to use the function with

 $(x,y[,z]) \rightarrow (x,y[,z],1)$

number of points N>=5, or to use multi-channel Nx1 or 1xN arrays.

Alphabetical List of Functions

2

2DRotationMatrix

A

Acc ApproxChains ArcLength

AdaptiveThreshold ApproxPoly

В

<u>BoundingRect</u> <u>BoxPoints</u>

C

<u>CalcBackProject</u> <u>CalibrateCamera2</u> <u>ConvexityDefects</u>

CalcBackProjectPatch CamShift CopyHist

<u>CalcEMD2</u> <u>Canny</u> <u>CopyMakeBorder</u>

CalcGlobalOrientation CheckContourConvexity CornerEigenValsAndVecs

<u>CalcHist</u> <u>ClearHist</u> <u>CornerHarris</u>

<u>CalcImageHomography</u> <u>ClearSubdivVoronoi2D</u> <u>CornerMinEigenVal</u>

<u>CalcMotionGradient</u> <u>CompareHist</u> <u>CreateConDensation</u>

<u>CalcOpticalFlowHS</u> <u>ConDensInitSampleSet</u> <u>CreateHist</u>

<u>CalcOpticalFlowLK</u> <u>ConDensUpdateByTime</u> <u>CreateKalman</u>

ContourArea	<u>CreatePOSITObject</u>
<u>ContourFromContourTree</u>	<u>CreateStructuringElementEx</u>
ConvertPointsHomogenious	CreateSubdivDelaunay2D
ConvexHull2	CvtColor
<u>DistTransform</u>	<u>DrawChessBoardCorners</u>
<u>EqualizeHist</u>	<u>Erode</u>
FindExtrinsicCameraParams2	<u>FindNextContour</u>
FindFundamentalMat	<u>FitEllipse</u>
FindHomography	FitLine2D
FindNearestPoint2D	<u>FloodFill</u>
<u>GetMinMaxHistValue</u>	<u>GetRectSubPix</u>
GetNormalizedCentralMoment	GetSpatialMoment
<u>GetQuadrangleSubPix</u>	<u>GoodFeaturesToTrack</u>
<u>HoughCircles</u>	HoughLines2
	ContourFromContourTree ConvertPointsHomogenious ConvexHull2 DistTransform EqualizeHist FindExtrinsicCameraParams2 FindFundamentalMat FindHomography FindNearestPoint2D GetMinMaxHistValue GetNormalizedCentralMoment GetQuadrangleSubPix

<u>InitUndistortMap</u> <u>Integral</u>

K

KalmanCorrect KalmanPredict

L

<u>Laplace</u> <u>LoadHaarClassifierCascade</u> <u>LogPolar</u>

V

MakeHistHeaderForArray MaxRect Moments

 $\underline{MatchContourTrees} \qquad \underline{MeanShift} \qquad \underline{MorphologyEx}$

<u>MatchShapes</u> <u>MinAreaRect2</u> <u>MultiplyAcc</u>

<u>MatchTemplate</u> <u>MinEnclosingCircle</u>

N

NormalizeHist

P

POSIT PreCornerDetect PyrSegmentation

PointPolygonTest ProjectPoints2 PyrUp

PointSeqFromMat PyrDown

Q

QueryHistValue_*D

R

ReadChainPoint ReleaseKalman Resize

ReleaseConDensation ReleasePOSITObject Rodrigues2

ReleaseHaarClassifierCascade ReleaseStructuringElement RunHaarClassifierCascade

ReleaseHist Remap RunningAvg

S

SampleLine Sobel Subdiv2DGetEdge

SegmentMotion SquareAcc Subdiv2DLocate

<u>SetHistBinRanges</u> <u>StartFindContours</u> <u>Subdiv2DRotateEdge</u>

SetImagesForHaarClassifierCascade StartReadChainPoints SubdivDelaunay2DInsert

Smooth Subdiv2DEdgeDst SubstituteContour

SnakeImage Subdiv2DEdgeOrg

Т

ThreshHist Threshold

U

Undistort2 UpdateMotionHistory

W

<u>WarpAffine</u> <u>WarpPerspective</u> <u>WarpPerspectiveQMatrix</u>

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