

# EXTRACCIÓN DE CONTORNOS

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Módulo imgproc (ej4)

Listas de puntos enlazados

[https://docs.opencv.org/4.5.5/d3/dc0/group\\_imgproc\\_shape.html](https://docs.opencv.org/4.5.5/d3/dc0/group_imgproc_shape.html)

[https://docs.opencv.org/4.5.5/df/d0d/tutorial\\_find\\_contours.html](https://docs.opencv.org/4.5.5/df/d0d/tutorial_find_contours.html)

# Extracción de Contornos: módulo imgproc

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- Ejemplo (**ej4.cpp**): extracción de contornos (listas de puntos enlazados) (partiremos del código de e1b.py)
- Extraer contornos de una imagen binaria (**Canny**):
  - Métodos:
    - void cv::**findContours**( cv::InputOutputArray **image**, cv::OutputArrayOfArrays **contours**, cv::OutputArray **hierarchy**, int **mode**, int **method**, cv::Point **offset**=cv::Point())

**Modes:** cv::RETR\_EXTERNAL, cv::RETR\_LIST, cv::RETR\_CCOMP, cv::RETR\_TREE

**Methods:** cv::CHAIN\_APPROX\_NONE, cv::CHAIN\_APPROX\_SIMPLE ,  
cv::CHAIN\_APPROX\_TC89\_L1, cv::CHAIN\_APPROX\_TC89\_KCOS

**hierarchy:** vector< cv::Vec4i> hierarchy[i][0]->next , [1] -> previous, [2]->child, [3]-> parent  
0-based indices in contours

```
cv::cvtColor( capture, gray_image, cv::COLOR_BGR2GRAY ); // transforms to gray level  
cv::Canny( gray_image, edge_image, 50, 200, 3); // extracts edges (binary)
```

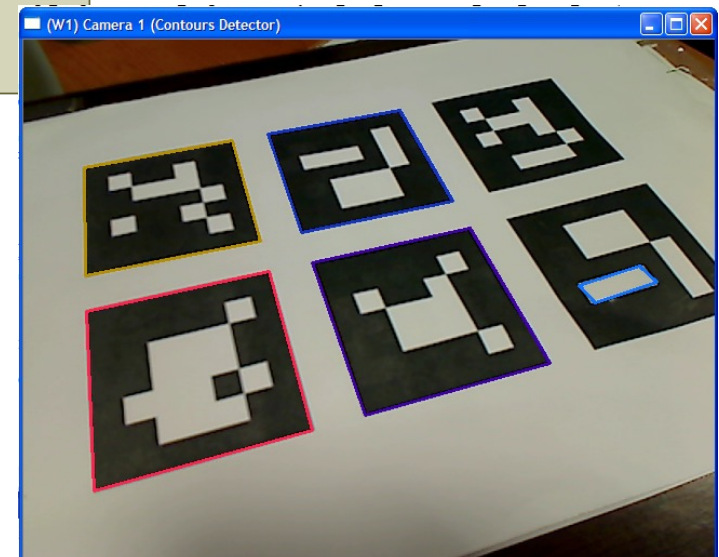
```
vector<vector< cv::Point> > contours_image;  
vector< cv::Vec4i> hierarchy;
```

```
cv::findContours ( edge_image, contours_image, hierarchy,  
cv::RETR_EXTERNAL, cv::CHAIN_APPROX_NONE );
```

# Extracción de Contornos: módulo imgproc

- Ejemplo (**ej4.cpp**): extracción de contornos (listas de puntos enlazados)
- Mostrar contornos:
  - void cv::drawContours(cv::InputOutputArray **image**, cv::InputArrayOfArrays **contours**, int **contourIdx**, const Scalar& color, int thickness=1, int lineType=LINE\_8, cv::InputArray hierarchy=noArray(), int maxLevel=INT\_MAX, cv::Point offset=cv::Point() )

```
for( unsigned int i = 0; i< contours_image.size(); i++ )  
{  
    cv::Scalar color( rand()&255, rand()&255, rand()&255 );  
    cv::drawContours( capture, contours_image, i, color, 2, cv::LINE_AA );  
}
```



# EJERCICIO 4b

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## Interpolación y filtrado de contornos (ej4b.cpp)

- Aproximación poligonal
- Propiedades de contornos
- Filtrado de contornos
- Persistencia: almacenamiento

# Extracción de Contornos: módulo imgproc

- Ejemplo (**ej4b.cpp**): Interpolar y filtrar contornos:
  - Métodos:
    - void cv::**approxPolyDP**( cv::InputArray **curve**, cv::OutputArray **approxCurve**, double **epsilon**, bool **closed**)

```
// Filter out non rectangular contours
vector<vector< cv::Point> > contours_filtered;

for ( unsigned int i=0;i<contours_image.size();i++ )
{
    //approximate to a polygon
    vector< cv::Point > approxCurve;
    cv::approxPolyDP(contours_image[i], approxCurve, double(contours_image[i].size())*0.05, true);

    //checks that the polygon has 4 points, is convex and is big enough
    if ( approxCurve.size() == 4  && cv::isContourConvex( approxCurve)
        && cv::contourArea( approxCurve)>200 )
        contours_filtered.push_back (approxCurve);
}

for( unsigned int i = 0; i< contours_filtered.size(); i++ )
{
    cv::Scalar color( rand()&255, rand()&255, rand()&255 );
    cv::drawContours( capture, contours_draw, i, color, 2, cv::LINE_AA );
}
```

# Extracción de Contornos: módulo imgproc

- Ejercicio: Almacenar los contornos en un fichero YAML/XML

```
// Writing the file if there are contours
if(contours_filtered.size() > 0 )
{
    cv::FileStorage fs("contours.yml", cv:: FileStorage::WRITE);
    if(fs.isOpened())
    {
        fs << "size" << (int)contours_filtered.size();
        fs << "contours" << "[:"; // first level (vector of contours)
        for( unsigned int i = 0; i< contours_filtered.size(); i++ )
        {
            fs << "[:"; //second level (vector of points)
            for( unsigned int j = 0; j< contours_filtered[i].size(); j++ )
            {
                fs << "{: "; // third level (class Point)
                fs << "x" << contours_filtered[i][j].x << "y" << contours_filtered[i][j].y;
                fs << "},";
            }
            fs << "]" ; // second level vector
        }
        fs << "]" ; // first level vector
        fs.release();
    }
}
```

# Extracción de Contornos: módulo imgproc

- **Ejercicio:** Leer los contornos de un fichero YAML/XML

```
// Reading contours from file
```

```
cv::FileStorage fs2("contours.yml", cv::FileStorage::READ);
if(fs2.isOpened())
{
    cv::FileNode node_level1 = fs2["contours"];           // first level (vector of contours)
    for( unsigned int i = 0; i< node_level1.size(); i++ )
    {
        cv::FileNode node_level2 = node_level1[i]; //second level (vector of points)
        vector<cv::Point> contour;
        for( unsigned int j = 0; j< node_level2.size(); j++ )
        {
            cv::Point pt;
            node_level2[j]["x"] >> pt.x;
            node_level2[j]["y"] >> pt.y;
            contour.push_back(pt);
        }
        cout << contour << endl;
    }
    fs2.release();
}
```

# EJERCICIO 4c (módulo imgproc)

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Detección de rectas y círculos mediante transformada de Hough (ej4c.cpp)

[https://docs.opencv.org/4.5.5/dd/d1a/group\\_imgproc\\_feature.html](https://docs.opencv.org/4.5.5/dd/d1a/group_imgproc_feature.html)

[https://docs.opencv.org/4.5.5/d9/db0/tutorial\\_hough\\_lines.html](https://docs.opencv.org/4.5.5/d9/db0/tutorial_hough_lines.html)

[https://docs.opencv.org/4.5.5/d4/d70/tutorial\\_hough\\_circle.html](https://docs.opencv.org/4.5.5/d4/d70/tutorial_hough_circle.html)



# Extracción de Contornos: módulo imgproc

- Ejemplo (**ej4c.cpp**): (partiremos del código de ej1.cpp)
- Extraer líneas rectas de una imagen binaria (**Canny**):
  - `cv::HoughLines`(InputArray **image**, OutputArray **lines**, double **rho**, double **theta**, int **threshold**, double **srn**=0, double **stn** =0, double **min\_theta** =0, double **max\_theta** =0 )

**image:** Binary image

**lines:** vector<cv::Vec2f> una línea por fila, 2 elementos: ( $\rho, \theta$ )  
 $\rho$  distance from the coordinate origin (0,0) (top-left corner of the image).  
 $\theta$  is the line rotation angle in radians ( 0~vertical line,  $\pi/2$ ~horizontal line ).

**rho:** Distance resolution of the accumulator in pixels.

**theta:** Angle resolution of the accumulator in radians.

**threshold:** Only those lines are returned that get enough votes ( >threshold ).

$$\rho = x \cdot \cos(\theta) + y \cdot \sin(\theta)$$

```
cv::Mat gray_image, edge_image;
```

```
cv::cvtColor( capture, gray_image, cv::COLOR_BGR2GRAY ); // transforms to gray level
```

```
cv::Canny( gray_image, edge_image, 80, 150, 3); // extracts edges (binary)
```

```
// find straight lines (Hough Transform)
```

```
cv::Mat lines;
```

```
cv::HoughLines(edge_image, lines, 1, CV_PI/180, 150);
```

# Extracción de Contornos: módulo imgproc

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- Ejemplo (**ej4c.cpp**):
- Visualización Líneas:

```
// Draw the lines
for (int i = 0; i < lines.size(); i++)
{
    float rho = lines[i][0], theta = lines[i][1];    // rho = x*cos(theta)+ y*sin(theta)
    cv::Point pt1, pt2;
    double a = cos(theta), b = sin(theta);
    double x0 = a * rho, y0 = b * rho;              // central point (rho is orthogonal to the line)
    pt1.x = cvRound(x0 + 1000 * (-b));              // two far away points of the line
    pt1.y = cvRound(y0 + 1000 * (a));
    pt2.x = cvRound(x0 - 1000 * (-b));
    pt2.y = cvRound(y0 - 1000 * (a));
    // cv::line do automatic clipping to the image size

    cv::Scalar color = cv::Scalar(rand() & 255, rand() & 255, rand() & 255);
    cv::line(capture, pt1, pt2, color, 2, cv::LINE_AA);
}
```

# Extracción de Contornos: módulo imgproc

- Ejemplo (**ej4c.cpp**):
- Transformada Hough Círculos:
  - **cv.HoughCircles**( InputArray **image**, OutputArray **circles**, int **method**, double **dp**, double **minDist**, double **param1**=100, double **param2**=100, int **minRadius**=0, int **maxRadius**=0 )

**image:**      **grayscale image**

[illegible]**rmethod:** cv::HOUGH\_GRADIENT, cv::HOUGH\_GRADIENT\_ALT.

**dp:** Inverse ratio of the accumulator resolution to the image resolution.

**minDist:** Minimum distance between the centers of the detected circles.

**param1:** higher threshold of Canny edge detector (the lower one is twice smaller).

**param2:** the accumulator threshold for the circle centers

$$r^2 = (x - x_c)^2 + (y - y_c)^2$$

```
// find circles (Hough Transform)
vector<cv::Vec3f> circles;
cv::HoughCircles(gray_image, circles, cv::HOUGH_GRADIENT, 1, 20, 150, 30, 20, 100);
```

# Extracción de Contornos: módulo imgproc

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- Ejemplo (**ej4c.cpp**):
- Visualización Círculos:

```
# Draw detected circles
for (int i = 0; i < circles.size(); i++)
{
    cv::Vec3i c = circles[i]; // integer approximation
    cv::Point center = cv::Point(c[0], c[1]);
    int r = c[2];

    cv::Scalar color = cv::Scalar(rand() & 255, rand() & 255, rand() & 255);
    cv::circle(capture, center, 1, color, 2, cv::LINE_AA);
    cv::circle(capture, center, r, color, 2, cv::LINE_AA);
}
```

# EJEMPLO 5

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## Segmentación de regiones por Color

- Conversión de color
- Extracción de canales de una imagen
- Umbralización
- Filtrado morfológico
- Extracción de contornos
- Cálculo de momentos

# Ejercicio: segmentación de regiones por color

- Programa base: **ej3.cpp**
- Módulos imgproc /core
- Funciones: Conversión de Color:
  - void cv::**cvtColor** (cv::InputArray **src**, cv::OutputArray **dst**, int code, int **dstCn=0** )
    - Códigos:
      - cv::COLOR\_BGR2GRAY, cv::COLOR\_GRAY2BGR
      - cv::COLOR\_BGR2HSV, cv::COLOR\_HSV2BGR, cv::COLOR\_BGR2HSV\_FULL, cv::COLOR\_HSV2BGR\_FULL
      - cv::COLOR\_BGR2HLS, cv::COLOR\_HLS2BGR, cv::COLOR\_BGR2HLS\_FULL, cv::COLOR\_HLS2BGR\_FULL
      - cv::COLOR\_BGR2XYZ, cv::COLOR\_XYZ2BGR
      - cv::COLOR\_BGR2Lab, cv::COLOR\_Lab2BGR (escalado 0-1.0 float32 CV\_32F)
      - cv::COLOR\_BGR2Luv, cv::COLOR\_Luv2BGR (escalado 0-1.0 float32 CV\_32F)
      - .....
  - void cv::**normalize**(InputArray **src**, InputOutputArray **dst**, double **alpha** = 1, double **beta** = 0, int **norm\_type**=NORM\_L2, int **dtype**=-1, InputArray **mask**=noArray() )
  - void cv::**split**(cv::InputArray **m**, cv::OutputArrayOfArrays **channels**)
    - vector< cv::Mat> channels;
  - void cv::**merge**(cv::InputArrayOfArrays **mv**, cv::OutputArray **dst**)



# Ejercicio: segmentación de regiones por color

- Módulos imgproc /core

- Umbralización:

- double cv::threshold(cv::InputArray **src**, cv::OutputArray **dst**, double **thresh**, double **maxval**, int **type**)

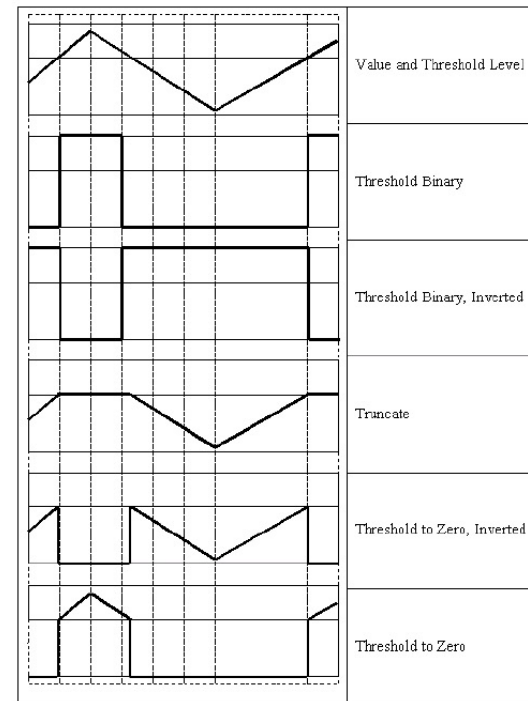
- Type:

- cv::THRESH\_BINARY,
- cv::THRESH\_BINARY\_INV
- cv::THRESH\_TRUNC
- cv::THRESH\_TOZERO
- cv::THRESH\_TOZERO\_INV

- **maxval**: valor alto de salida (BINARY)

- Cálculo umbral automático:

- (+ cv::THRESH\_OTSU)



- double cv::inRange (cv::InputArray **src**, cv::InputArray **lowerb**, cv::InputArray **upperb**, cv::OutputArray **dst**)
  - **lowerb**, **upperb**: pueden ser imágenes o escalares

$$\text{dst}(I) = \text{lowerb}(I)_0 \leq \text{src}(I)_0 \leq \text{upperb}(I)_0$$

# Ejercicio: segmentación de regiones por color

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- Módulo imgproc

- Funciones:

- Morfología:

- void cv::**erode**( cv::InputArray **src**, cv::OutputArray **dst**, cv::InputArray **kernel**,  
cv::Point **anchor**=Point(-1,-1), int **iterations**=1)
- void cv::**dilate**( cv::InputArray **src**, cv::OutputArray **dst**, cv::InputArray **kernel**,  
cv::Point **anchor**=Point(-1,-1), int **iterations**=1)
- void cv::**morphologyEx**(cv::InputArray **src**, cv::OutputArray **dst**, int **op**, cv::InputArray **kernel**,  
cv::Point **anchor**=Point(-1,-1), int **iterations**=1)
  - op: cv::**MORPH\_OPEN**, cv::**MORPH\_CLOSE**, cv::**MORPH\_GRADIENT**,  
cv::**MORPH\_TOPHAT**, cv::**MORPH\_BLACKHAT**

**Kernel:** Mat cv::**getStructuringElement**( int **shape**, cv::Size **ksize**, cv::Point **anchor**=Point(-1,-1))  
shape: cv::**MORPH\_CROSS**, cv::**MORPH\_RECT**, cv::**MORPH\_ELLIPSE**

- Operaciones lógicas:

- void cv::**bitwise\_and**(cv::InputArray **src1**, cv::InputArray **src2**, cv::OutputArray **dst**,  
cv::InputArray **mask**=noArray())
- void cv::**bitwise\_or**(cv::InputArray **src1**, cv::InputArray **src2**, cv::OutputArray **dst**,  
cv::InputArray **mask**=noArray())
- void cv::**bitwise\_xor**(cv::InputArray **src1**, cv::InputArray **src2**, cv::OutputArray **dst**,  
cv::InputArray **mask**=noArray())
- void cv::**bitwise\_not**(cv::InputArray **src**, cv::OutputArray **dst**, cv::InputArray **mask**=noArray())



# Ejercicio: segmentación de regiones por color

- Módulo imgproc
- Funciones:
  - Momentos:
    - `cv::Moments` `cv::moments(cv::InputArray array, bool binaryImage=false )`
    - `cv::Moments` class:
      - spatial moments -> **double** m00, m10, m01, m20, m11, m02, m30, m21, m12, m03;
      - central moments -> **double** mu20, mu11, mu02, mu30, mu21, mu12, mu03;
      - central normalized moments -> **double** nu20, nu11, nu02, nu30, nu21, nu12, nu03;
  - `void cv::HuMoments( const cv::Moments& moments, double hu[7])`
  - `void cv::HuMoments( const cv::Moments& moments, cv::Mat &hu)`

$$m_{ji} = \sum_{x,y} (\text{array}(x,y) \cdot x^j \cdot y^i)$$

$$\bar{x} = \frac{m_{10}}{m_{00}}, \bar{y} = \frac{m_{01}}{m_{00}}$$

$$\mu_{ji} = \sum_{x,y} (\text{array}(x,y) \cdot (x - \bar{x})^j \cdot (y - \bar{y})^i)$$

$$\nu_{ji} = \frac{\mu_{ji}}{m_{00}^{((i+j)/2+1)}}$$

$$hu[0] = \eta_{20} + \eta_{02}$$

$$hu[1] = (\eta_{20} - \eta_{02})^2 + 4\eta_{11}^2$$

$$hu[2] = (\eta_{30} - 3\eta_{12})^2 + (3\eta_{21} - \eta_{03})^2$$

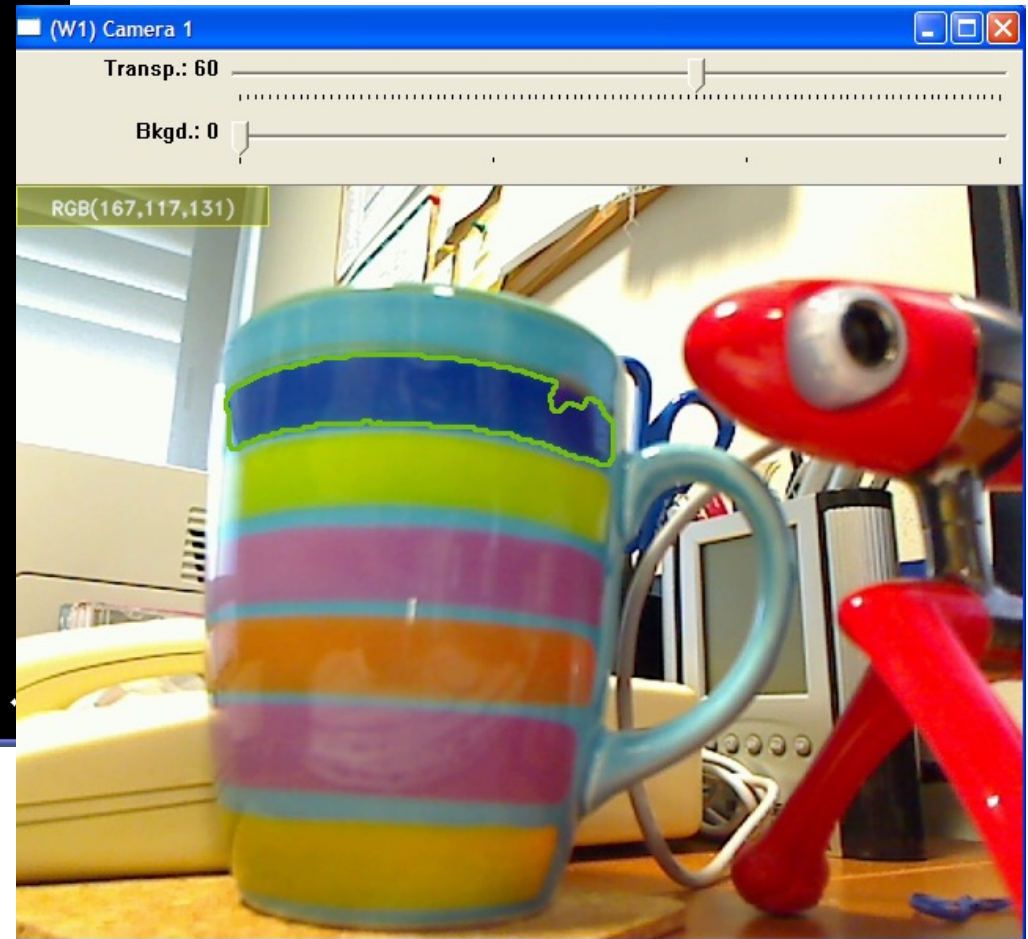
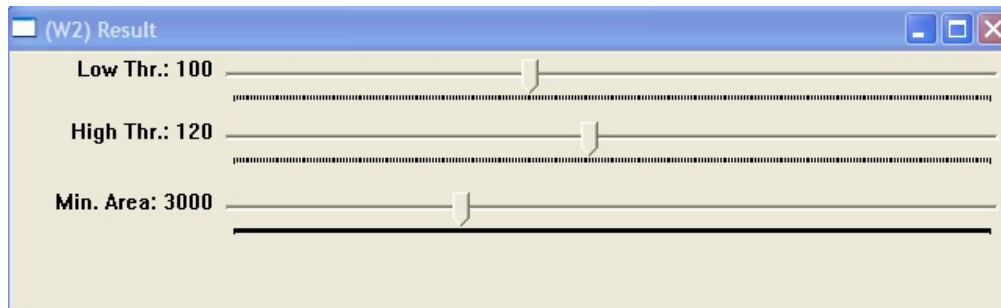
$$hu[3] = (\eta_{30} + \eta_{12})^2 + (\eta_{21} + \eta_{03})^2$$

$$hu[4] = (\eta_{30} - 3\eta_{12})(\eta_{30} + \eta_{12})[(\eta_{30} + \eta_{12})^2 - 3(\eta_{21} + \eta_{03})^2] + (3\eta_{21} - \eta_{03})(\eta_{21} + \eta_{03})[3(\eta_{30} + \eta_{12})^2 - (\eta_{21} + \eta_{03})^2]$$

$$hu[5] = (\eta_{20} - \eta_{02})[(\eta_{30} + \eta_{12})^2 - (\eta_{21} + \eta_{03})^2] + 4\eta_{11}(\eta_{30} + \eta_{12})(\eta_{21} + \eta_{03})$$

$$hu[6] = (3\eta_{21} - \eta_{03})(\eta_{21} + \eta_{03})[3(\eta_{30} + \eta_{12})^2 - (\eta_{21} + \eta_{03})^2] - (\eta_{30} - 3\eta_{12})(\eta_{21} + \eta_{03})[3(\eta_{30} + \eta_{12})^2 - (\eta_{21} + \eta_{03})^2]$$

# Ejercicio: segmentación de regiones por color



## Ejercicio: segmentación de regiones por color

- Programa base: **ej5.cpp** (partiremos del código de ej3b.cpp)

```
int AREA_MIN = 1000;           // min area
int TH_LOW = 100;              // Low and High Hue threshold
int TH_HIGH = 120;
int SI_MIN = 20;              // Filter out regions with low saturation or intensity
```

```
cv::cvtColor( capture, hsv, cv::COLOR_BGR2HSV_FULL ); // transforms to HSV
```

```
vector<cv::Mat> channels;
cv::split(hsv, channels)
cv::Mat hue = channels[0];
cv::Mat sat = channels[1];
cv::Mat intensity = channels[2];
```

```
cv::inRange(hsv, cv::Scalar()TH_LOW, TH_HIGH, res); // Hue segmentation
```

```
// Filter out regions with low saturation or intensity
```

```
cv::threshold(sat, mask1, SI_MIN, 255, cv::THRESH_BINARY); //saturation threshold
cv::threshold(intensity, mask2, SI_MIN, 255, cv::THRESH_BINARY); //intensity threshold
cv::bitwise_and(mask1, mask2, mask); // useful region
cv::bitwise_and(res, mask, res); // filters out noisy regions
```

```
// morphological filter (opening/closing)
```

```
cv::Mat kernel = cv::getStructuringElement(cv::MORPH_CROSS, cv::Size(3, 3));
cv::morphologyEx(res, res, cv::MORPH_OPEN, kernel, cv::Point(-1,-1), 2);
cv::morphologyEx(res, res, cv::MORPH_CLOSE, kernel, cv::Point(-1,-1), 2);
```

# Ejercicio: segmentación de regiones por color

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- Programa base: **ej5.cpp**

```
# find contours
edge_image = cv.Canny(res, threshold1=50, threshold2=200)

# find contours
cv::findContours ( edge_image , contours_image, hierarchy, cv::RETR_EXTERNAL,
                  cv::CHAIN_APPROX_NONE );

// Filter out small contours and finds bigger contour
vector<vector<cv::Point> > contours_draw;
unsigned int id_max=0;
double area_max=0.0;

for ( unsigned int i=0, j=0; i<contours_image.size();i++ )
{
    double area = cv::contourArea(contours_image[i]);
    if ( area > AREA_MIN )
    {
        contours_draw.push_back(contours_image[i]);
        if(area>area_max)    { id_max= j; area_max = area; }
        j++;
    }
}
```

# Ejercicio: segmentación de regiones por color

---

- Programa base: **ej5.cpp**

```
// Calculates Hu-moments for bigger contour (if any)
if(contours_draw.size() >0)
{
    cv::Moments m = cv::moments(contours_draw[id_max]);
    cv::Mat hu;
    cv::HuMoments(m, hu);
    //cout << "Hu-moments: " << hu << endl;
}
```

```
// Draw contours
for( unsigned int i = 0; i< contours_draw.size(); i++ )
{
    cv::Scalar color = cv::Scalar( rand()&255, rand()&255, rand()&255 );
    cv::drawContours( displImage, contours_draw, i, color, 2, cv::LINE_AA );
}
```

# EJERCICIO 5b

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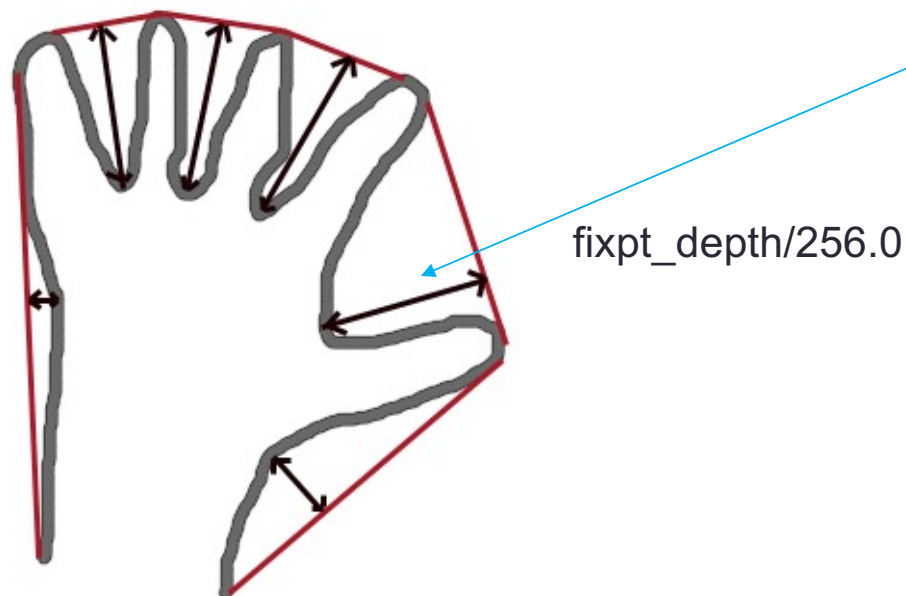
## Segmentación de regiones por Color

- Incorporar al ejemplo previo el procesamiento del convexHull para la detección de formas

# Ejercicio: segmentación de regiones por color

## • Convex Hull

- void cv::**convexHull** (cv::InputArray **points**, cv::OutputArray **hull**, bool **clockwise**=false, bool **returnPoints**=true)
  - **points**: vector< cv::Point > (un solo contorno)
  - **hull**: (2 opciones):
    - Contorno (puntos): vector< cv::Point >
    - Índices de los puntos del contorno: **vector<int>**
- void cv::**convexityDefects** (cv::InputArray **contour**, cv::InputArray **convexhull**, cv::OutputArray **convexityDefects**)
  - **convexhull** : Índices del contorno: **vector<int>**
  - **convexityDefects** : **vector< cv::Vec4i>** : (start\_index, end\_index, farthest\_pt\_index, **fixpt\_depth**)



# Ejercicio: segmentación de regiones por color

- Programa base: **ej5b.cpp** (partiremos del código de ej5.cpp)

- LUT: `cv::LUT( InputArray src, InputArray lut, OutputArray dst )`      $\text{dst}(\mathbf{I}) \leftarrow \text{lut}(\text{src}(\mathbf{I}))$

```
// Normalize HUE channel (selected hue value in the middle(128))
int HUE_CENTER = 10; // Hue valued to be centered in HUE normalization
```

```
// Normalize HUE channel (selected hue value in the middle(128))
cv::Mat lookUpTable(1, 256, CV_8U);
uchar* p = lookUpTable.data; // faster that using at<> method
for (int i = 0; i < 256; ++i)
    p[i] = (i + 128 - HUE_CENTER) % 256;
```

```
cv::LUT(hue, lookUpTable, hue);
```

```
// Calculates Convex Hull of the biggest contour (if any)
vector<int> convexhull;
vector<cv::Vec4i> convexitydefects;
double convexity_defect = 0.0;
if (contours_image.size() > 0)
{
    cv::convexHull(contours_image[id_max], convexhull, true, false); // Convex Hull indexes clockwise
    cv::convexityDefects(contours_image[id_max], convexhull, convexitydefects);

    // calculates mean of convexity defects
    for (unsigned int i = 0, j = 0; i < convexitydefects.size(); i++)
        convexity_defect += convexitydefects[i][3] / 256.0;

    convexity_defect /= convexitydefects.size();
    cout << "Convexity Defect: " << convexity_defect << endl;
}
```



## Ejercicio: segmentación de regiones por color

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- Programa base: **ej5b.cpp**
  - Visualiza contorno y Convex-Hull

```
// Draw contours and convexhull
if (contours_image.size() > 0)
{
    // Draws selected contour
    cv::drawContours( displImage, contours_image, id_max, cv::Scalar(0,255,0), 2, cv::LINE_AA );

    // Draws convex hull for the biggest contour
    for (unsigned int i = 0; i < convexhull.size() - 1; i++)
        cv::line(displImage, contours_image[id_max][convexhull[i]],
                 contours_image[id_max][convexhull[i + 1]], cv::Scalar(0, 0, 255), 2, cv::LINE_AA);
}
```