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# Edge-based Image Segmentation

## 基于边缘检测的图像分割

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CVBIOUC

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# What?

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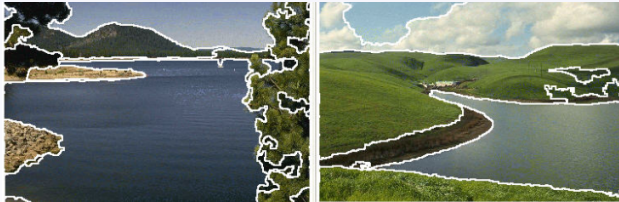
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# Edge & Boundary

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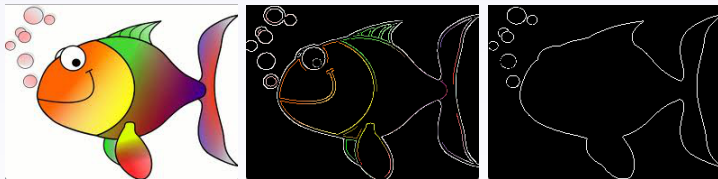
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## Edge & Boundary



The edge of object may be not a boundary, the boundary may also be not edge.



# Problems

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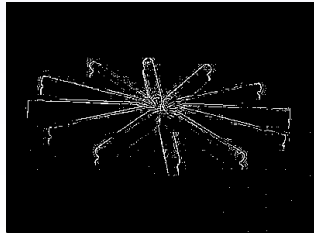
#### Edge Tracking

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Edge detection is a simple and fast technique used in segmentation methods. However, there also are some problems:

- Noise and background affect the accurate of edge detection.
- Edges are the sign of lack of continuity, and ending.





# Steps in Edge Detection

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- 1 **Filtering:** Filtering to reduce noise results in a loss of edge strength.
- 2 **Enhancement:** In order to facilitate the detection of edges, it is essential to determine changes in intensity in the neighborhood of a point.
- 3 **Detection:** Find the zero crossing and peak value to detect edge.



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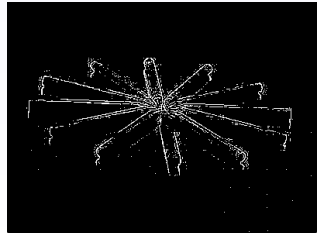
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Edge detection is a simple and fast technique used in segmentation methods. However, there also are some problems:

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# Step in Image Segmentation

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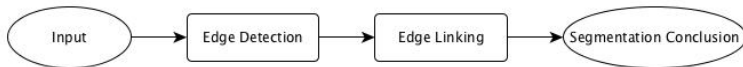
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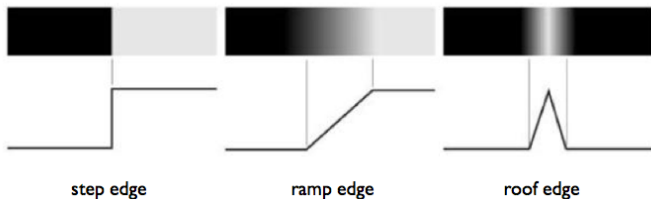
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Three edge types and definitions:

- Step edge
- Ramp edge
- Roof edge





# Edge Detection

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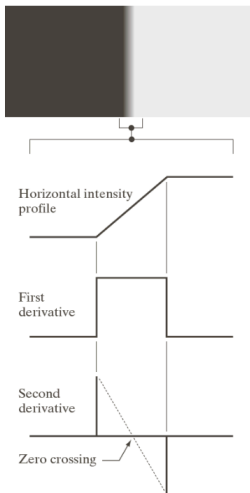
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# Edge Detection Techniques<sup>1</sup>

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- Roberts Edge Detection
- Sobel Edge Detection
- Prewitt Edge Detection
- Kirsch Edge Detection
- Marr-Hildreth Edge Detection (LoG)
- Canny Edge Detection

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<sup>1</sup>Muthukrishnan.R *et al.*, “Edge Detection Techniques For Image Segmentation”, IJCSIT, 2011.



# Edge Detection Techniques

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## ■ Roberts Edge Detection

-1	0
0	+1

0	-1
+1	0

## ■ Sobel Edge Detection

-1	-2	-1
0	0	0
+1	+2	+1

-1	0	-1
-2	0	+2
-1	0	+1

## ■ Prewitt Edge Detection

-1	-1	-1
0	0	0
+1	+1	+1

-1	0	+1
-1	0	+1
-1	0	+1



# Marr-Hildreth Edge Detection (LoG)

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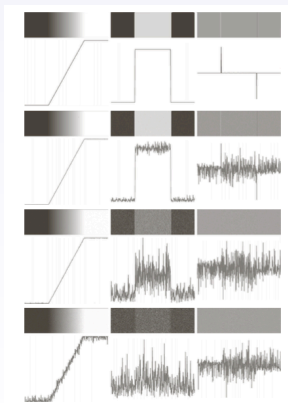
Curve Fitting

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This method combines Gaussian filtering with the Laplacian for edge detection.

How does it work?

- The edge points of an image can be detected by **second derivation**.
- However, the second derivation is very sensitive to noise. A **Gaussian filter** is used to swipe away noise from the image.





# Canny Edge Detection

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Canny is the best edge detection detector.

Three basic objectives:

- Low error rate
- Edge points should be well localized



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Canny algorithm:

- Smooth image
- Compute gradient
- Non-maxima suppression
- Double thresholding





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## Non-maxima suppression (NMS)

- Problem: Edges generated using gradient typically contain wide ridges around local maxima.
- Use non-maxima suppression to thin those ridges to find thin edges corresponding to local maxima.







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## Double thresholding

- Problem: The received image may still contain false edge points.





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- Dynamic Programming
- ...



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Each point is linked to the adjacent if magnitude and direction of the gradient are similar.

$e(x, y)$  is magnitude of the gradient,  $\phi(x, y)$  is the direction of the gradient, if two each points meet the following conditions:

$$\left\{ \begin{array}{l} |e(x_i, y_i) - e(x_j, y_j)| \leq E \\ |\phi(x_i, y_i) - \phi(x_j, y_j)| \leq A \\ |e(x_i, y_i)|, |e(x_j, y_j)| > E \end{array} \right.$$



# Curve Fitting

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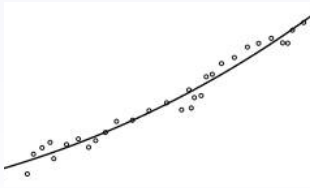
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Starting from a set of edge points, segments of a polygonal line are iteratively added until all the points are close enough to a segment.





# Polygon Fitting

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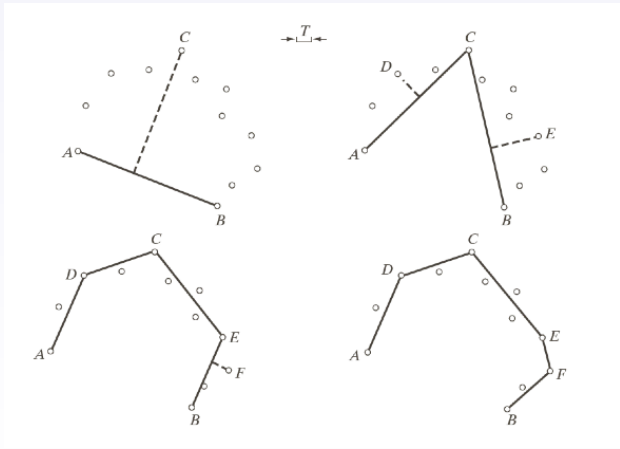
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# Hough Transform

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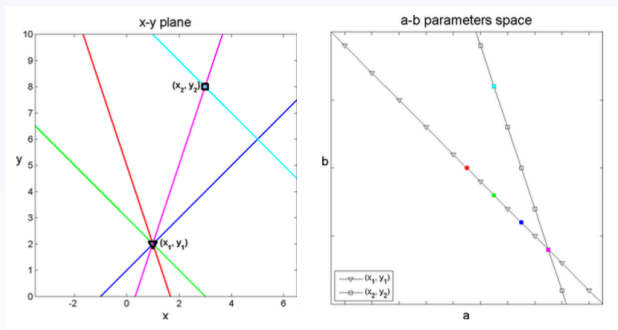
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Find the most probable lines.





# Hough Transform

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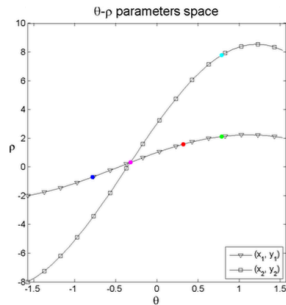
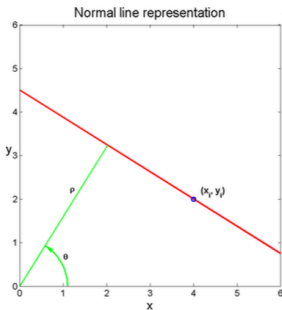
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# Thanks