## 1. Introduction > 1.1 Introduction / Overview

#### Please provide the introduction / overview on this lesson

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#### Overview

In this chapter, you are going to learn about:

- Introduction to convolution
- Different types of filter
- How to choose threshold

## 1. Introduction > 1.2 Learning Content

Please make sure the hierarch of the content is well formed. Please organize the lesson in 3-5 main topics and use 3-level headings.

Level 1	Level 2	Level 3
1. Convolution	1.1 Types of Filter	
2. Threshold	2.1 Choice of Threshold	

## 1. Introduction > 1.3 Learning Content

#### ID Will do it by looking at 1.1 Lesson overview

#### **Image Processing**

- I. General knowledge in image p rocessing and multimedia
- 1. Introduction to Image Processing
- 2. Data Structure and Color of Images
- 3. Ms. Visual Studio 2008 and OpenCV
- 4. Introduction to Multimedia Systems
- 5. Introduction to Video and Lossless Compression
- 6. Huffman Coding
- 7. LZ77
- 8. LZ78
- 9. LZW
- II. Advance knowledge in image segmentation and luminance
- 10. Sampling
- 11. Image Segmentation-I
- 12. Image Segmentation-II
- 13. Luminance and Histogram Equalization

## 1. Introduction > 1.4 Learning Objectives

Please provide objective of the lesson by high light keyword and follow (Audience, Behavior, Condition, Degree) to write the objective

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☐ C : Only Video

#### Objective

Upon completion of this chapter, you will be able to:

- Apply algorithm of **sobel filter** to detect edges from images.
- · Understand what threshold is.

## 1. Introduction > 1.5 Keywords

#### Please provide keywords of the lesson with explanation

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 $\ \square$  C : Only Video

Keywords	Description
Pointwise	is used to indicate that a certain property is defined by considering each value $f(x)$ of some function $f$ . Example of pointwise addition: $(f + g)(x) = f(x) + g(x)$
Translation	is a <b>geometric transformation</b> that moves every point of a figure or a space by the same amount in a given direction.
Cross-correlation	is a measure of similarity of two series as a function of the lag of one relative to the other. This is als o known as a sliding <b>dot product</b> or sliding inner-product.
Hysteresis	is the time-based dependence of a system's output on present and past inputs.

## 2. Learn> Topic: 1. Convolution

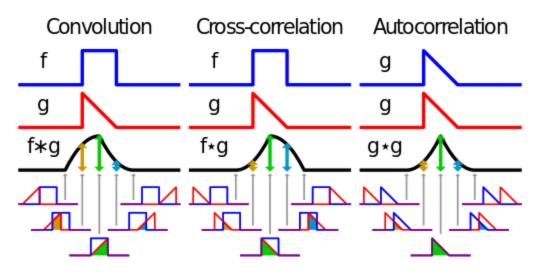
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Q: What is convolution?

- A: **Convolution** is a mathematical operation on two functions (**f** and **g**); it produc es a third function giving the integral of the **pointwise** multiplication of the two functions as a function of the amount that one of the original functions is **translated**.
- Convolution is similar to cross-correlation.
- It has applications that include probability, statistics, computer vision, natural lan guage processing, image and signal processing, engineering, and differential equations.

(1) Learning Contents



Visual comparison of convolution, cross-correlation and autocorrelation.

## 2. Learn> Topic: 1. Convolution

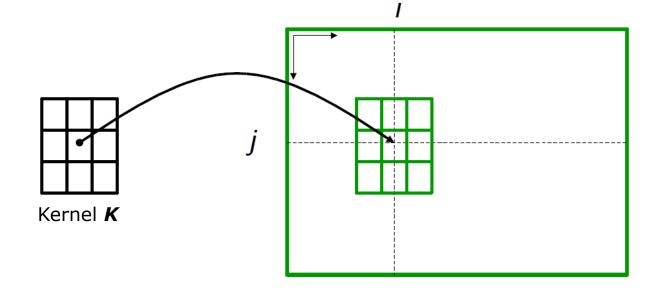
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■ Convolution operator with a mask or kernel *K*:

$$I_2(i,j) = \sum_{k=0}^{2} \sum_{l=0}^{2} I_1(i+k-1,j+l-1)K(k,l)$$



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■ There are several types of filter such as:

> Robert filter: in 1965.

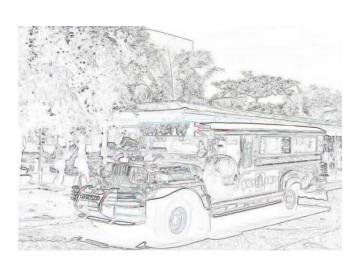
> **Sobel filter**: in 1970.

> **Prewitt filter**: in 1970.

> Kirsch filter: in 1971.



Source image



Example of Sobel Filter

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#### Robert filter (1965):

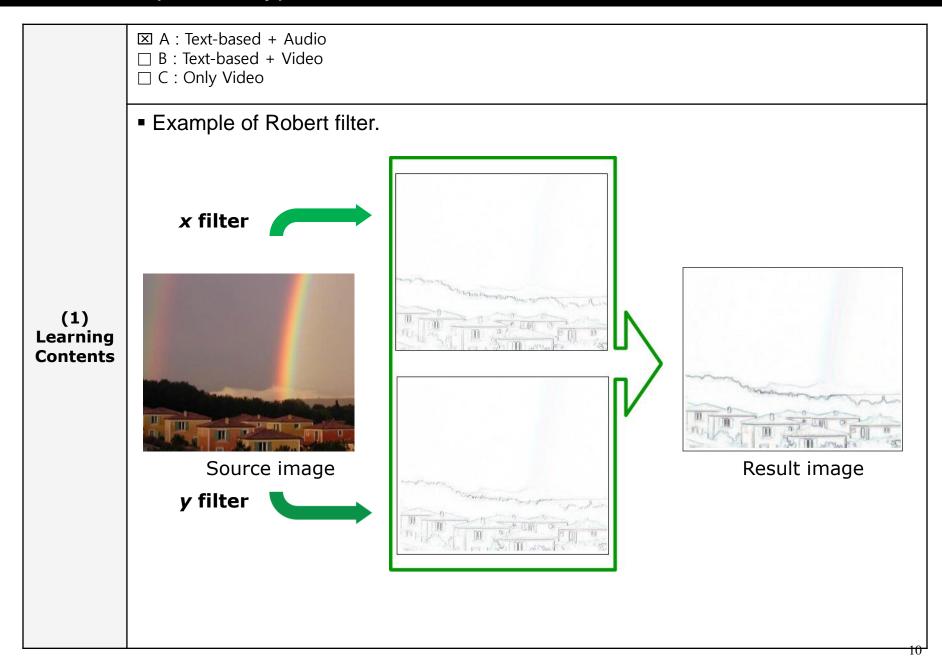
$$\frac{dI}{dx} = \begin{pmatrix} 0 & -1 \\ 1 & 0 \end{pmatrix} \qquad \frac{dI}{dy} = \begin{pmatrix} -1 & 0 \\ 0 & 1 \end{pmatrix}$$

Magnitude = edge strength

$$\sqrt{(\frac{dI}{dx})^2 + (\frac{dI}{dy})^2}$$

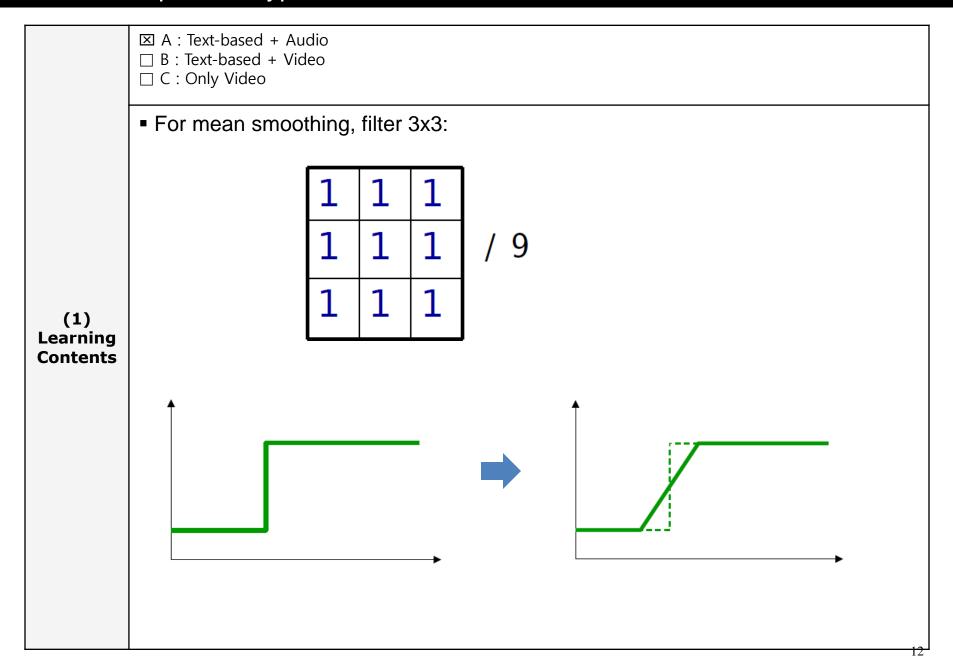
Direction of edge normal

$$\arctan((\frac{dI}{dy})/(\frac{dI}{dx}))$$





- Although Robert filter can detect edges, it is still sensible to noise.
- Normally, all noises have high frequencies.
- In order to eliminate these high frequencies (noises), we need to do **smoothing**.
- There are several types of smoothing:
  - ➤ **Mean smoothing or median filter**: is very widely used in digital image pro cessing because it preserves edges while removing noise (under certain c onditions).
  - Guassian smoothing: is the result of blurring an image by a Gaussian function.
  - **Exponential smoothing**: is used to reduce irregularities (random irregular rising) in time series data, thus providing a clearer view of the true underlying behaviour of the series.
  - Laplacian smoothing: is an algorithm to smooth a polygonal mesh.



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For Gaussian smoothing, it has an equation to reduce noises:

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$$h(x,y) = 1/(2\pi \sigma^2) \exp(-(x^2+y^2)/(2\sigma^2))$$

Truncated and discretized Gaussian:

(1) Learning Contents

0	1	0
1	4	1
0	1	0

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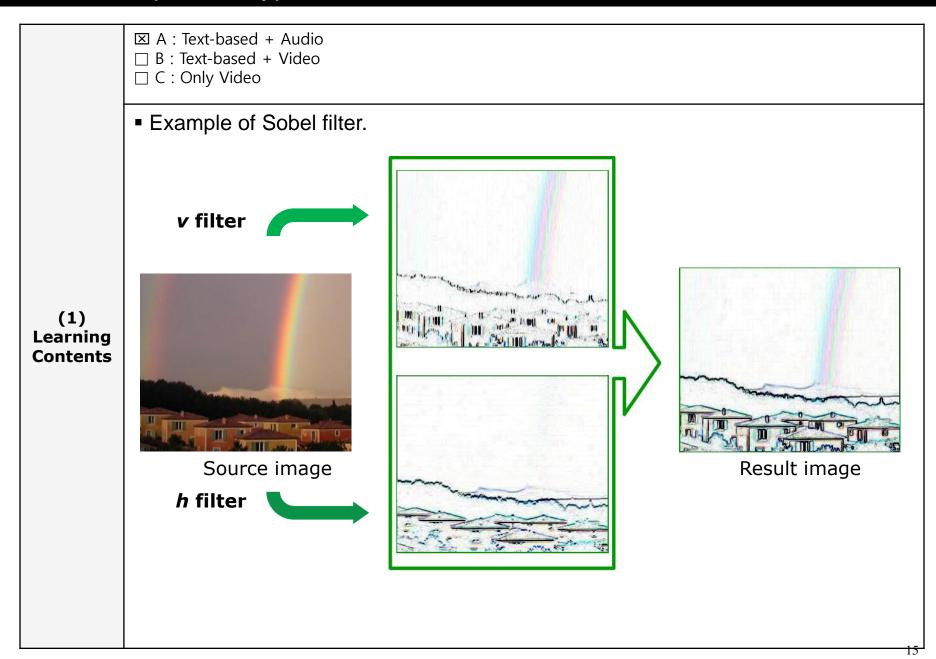
#### ■ Sobel filter (1970):

- Convolution
  - o Smoothing [1 2 1]
  - Derivative [1 0 –1]

$$\frac{dI}{dx} = \begin{pmatrix} 1 & 0 & -1 \\ 2 & 0 & -2 \\ 1 & 0 & -1 \end{pmatrix} / 4 \qquad \frac{dI}{dy} = \begin{pmatrix} -1 & -2 & -1 \\ 0 & 0 & 0 \\ 1 & 2 & 1 \end{pmatrix} / 4$$

➤ Mean of derivatives at x and x – 1:

$$\frac{I[x+1] - I[x-1]}{2}$$



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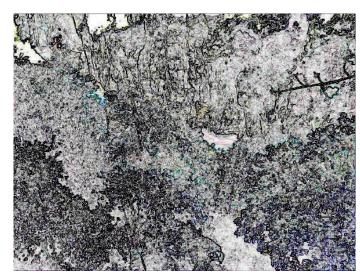
☐ C : Only Video

■ Another example of Sobel filter.





Source image



Result image

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☐ C : Only Video

#### Prewitt filter (1970):

$$\begin{pmatrix} 1 & 0 & -1 \\ 1 & 0 & -1 \\ 1 & 0 & -1 \end{pmatrix}, \begin{pmatrix} 1 & 1 & 0 \\ 1 & 0 & -1 \\ 0 & -1 & -1 \end{pmatrix}, \begin{pmatrix} 1 & 1 & 1 \\ 0 & 0 & 0 \\ -1 & -1 & -1 \end{pmatrix} \dots$$

#### (1) Learning Contents

#### • Kirsch filter (1971):

$$\begin{pmatrix} 5 & -3 & -3 \\ 5 & 0 & -3 \\ 5 & -3 & -3 \end{pmatrix}, \begin{pmatrix} 5 & 5 & -3 \\ 5 & 0 & -3 \\ -3 & -3 & -3 \end{pmatrix}, \begin{pmatrix} 5 & 5 & 5 \\ -3 & 0 & -3 \\ -3 & -3 & -3 \end{pmatrix} \dots$$

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## 2. Learn> Topic: 2. Threshold

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Q: What is thresholding?

- A: **Thresholding** is the simplest method of image segmentation. From a **graysc ale** image, thresholding can be used to create **binary images** (Shapiro, et al. 2001:83).
- The simplest thresholding methods replace in an image with a black pixel if the i mage intensity  $I_{i,j}$  is less than some fixed constant T (that is,  $I_{i,j} < T$ ), or a white pixel if the image intensity is greater than that constant.
- In the example image below, this results in the dark tree becoming completely bl ack, and the white snow becoming completely white.



Original image



Example of a threshold effect used on an image

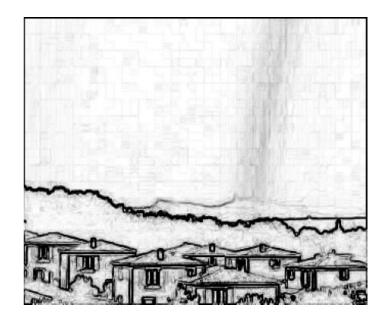
## 2. Learn> Topic: 2. Threshold

☑ A : Text-based + Audio

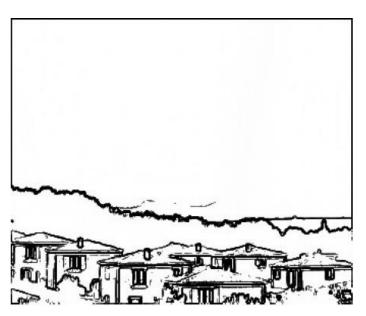
☐ B: Text-based + Video

☐ C : Only Video

■ In order to enhance the result, we eliminate all the pixels that have a value below a minimum threshod (*T*).



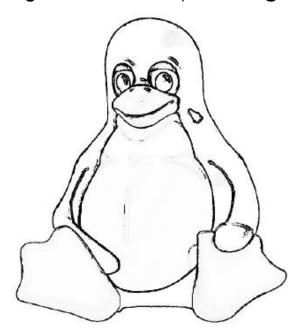
Result image



Result image and threshold

## 2. Learn> Topic: 2.1 Choice of Threshold

- ☒ A : Text-based + Audio☒ B : Text-based + Video
- ☐ C : Only Video
- Q: How to choose the threshold?
- A: We can choose the threshold by 2 different values:
  - 1) Low threshold: all edges are detected but we have false positives.
  - 2) High threshold: all the pixels detected are edge pixels but we are missin g some of them (false negatives).



Example of low threshold



Example of high threshold

## 2. Learn> Topic: 2.1 Choice of Threshold

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- Hysteresis thresholding: thresholding by 2 thresholds for edge detection.
  - Low thresholded edges which are connected to high thresholded edges are retained.
  - Low thresholded edges which are non connected to high thresholded edge s are **removed**.



Example of Canny Deriche edge detection



Hysteresis thresholding

#### 4. Outro > 4.1 Summarize

# Please give a lesson summary. Each topic can be summarized into a sentence, diagram, or even a word.

☐ B: Text-based + Video

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#### **Summarize**

• **Convolution** is a mathematical operation on two functions (f and g). Convolution operator with a mask or kernel K:

$$I_2(i,j) = \sum_{k=0}^{2} \sum_{l=0}^{2} I_1(i+k-1,j+l-1)K(k,l)$$

- **Thresholding** is the simplest method of image segmentation. We can choose the threshold by 2 different values:
  - 1) Low threshold: all edges are detected but we have false positives.
  - 2) **High threshold:** all the pixels detected are edge pixels but we are mis sing some of them (**false negatives**).

## 4. Outro > 4.2 References

#### Provide references if you think the students need.

#### Reference

- "Digital Image Processing" par W. K. Pratt, John Wiley & Sons, inc., Third Edition, 2001
- "Digital Image Processing" par Gonzalez et Woods, Prentice Hall, Second Edition, 2002
- http://homepages.inf.ed.ac.uk/rbf/CVonline/books.htm
- http://www.dai.ed.ac.uk/CVonline/transf.htm

## 4. Outro > 4.3 Assignment

## Please provide the assignment such as exercise, discussion, research topic, Short essay, case studies, ....

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#### Assignment

- 1) Find a mask or kernel **X** and **Y** of Sobel filter (3x3)?
- In your opinion, what is the range of threshold except black and white image? (from which value to which value)

## 4. Outro > 4.4 Next Lesson

# This is the end of the lesson. Ending message and introduction to next lesson including lesson title and topics should be given.

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#### Overview

- Concept of darkness and brightness
- Algorithm of histogram equalization

	Luminance and Histogram Equalization
	1. Luminance
Next Lesson Title	2. Histogram Equalization