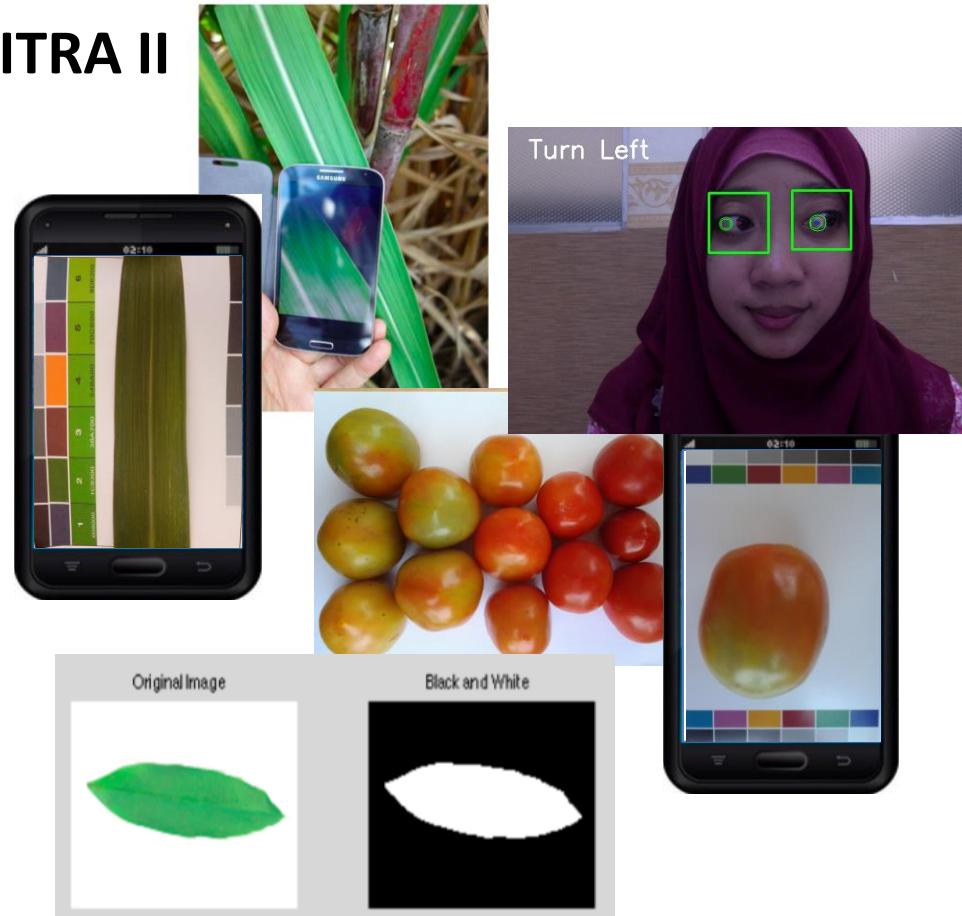


Pengolahan Citra Digital

4. PENINGKATAN KUALITAS CITRA II (*FILTERING*)

IFK15036, 3 credits



Team Teaching :

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OUTLINE BAB-4

- Dasar Spatial Filter
- Konvolusi
- Filtering* Ketetanggaan Pada Piksel
 - Smoothing* Spatial Filter
 - Mean Filter
 - Median Filter
 - Gaussian Filter
 - Sharpening* Spatial Filter
 - Laplace Filter (*high pass filter*)
 - Sobel Filter

- Filter juga sering disebut window atau mask (teori konvolusi)
- Umumnya memiliki ukuran ganjil 3x3, 5x5, 7x7 dst, atau juga sering disebut matrik bujursangkar.
- Filter beroperasi dengan cara dikonvolusikan dengan citra yang difilter
 - Dalam proses konvolusi filter bergerak 1 piksel ke kanan, operasi terjadi dan bergerak sampai baris diselesaikan dan pindah 1 baris di bawahnya dst.
 - Simbol matematis yang digunakan adalah bintang (*).

a1	a2	a3
a4	a5	a6
a7	a8	a9

Pusat filter akan diposisikan pada pixel yang sedang diproses

$h_{i-1,j-1}$	$h_{i-1,j}$	$h_{i-1,j+1}$
$h_{i,j-1}$	$h_{i,j}$	$h_{i,j+1}$
$h_{i+1,j-1}$	$h_{i+1,j}$	$h_{i+1,j+1}$

Mask dengan ukuran 3x3

- ▶ Mask dengan ukuran 3x3 direpresentasikan dalam matrik H sebagai berikut:

$$H = \begin{vmatrix} h_{i-1,j-1} & h_{i-1,j} & h_{i-1,j+1} \\ h_{i,j-1} & h_{i,j} & h_{i,j+1} \\ h_{i+1,j-1} & h_{i+1,j} & h_{i+1,j+1} \end{vmatrix}$$

- ▶ Sebuah citra F dengan ukuran **tinggi x lebar** (MxN)

$$F = \begin{vmatrix} f_{1,1} & f_{1,2} & f_{1,3} & \cdots & f_{1,N} \\ f_{2,1} & f_{2,2} & f_{2,3} & \cdots & f_{2,N} \\ f_{3,1} & f_{3,2} & f_{3,3} & \cdots & \vdots \\ \vdots & \vdots & \vdots & \ddots & \vdots \\ f_{M,1} & f_{M,2} & f_{M,3} & \cdots & f \end{vmatrix}$$

- Konvolusi (*) antara matrik citra **F** dan **H** adalah:

$$\mathbf{G} = \mathbf{F} * \mathbf{H}$$

- Nilai elemen dari matrik citra **G** adalah $g(x, y)$

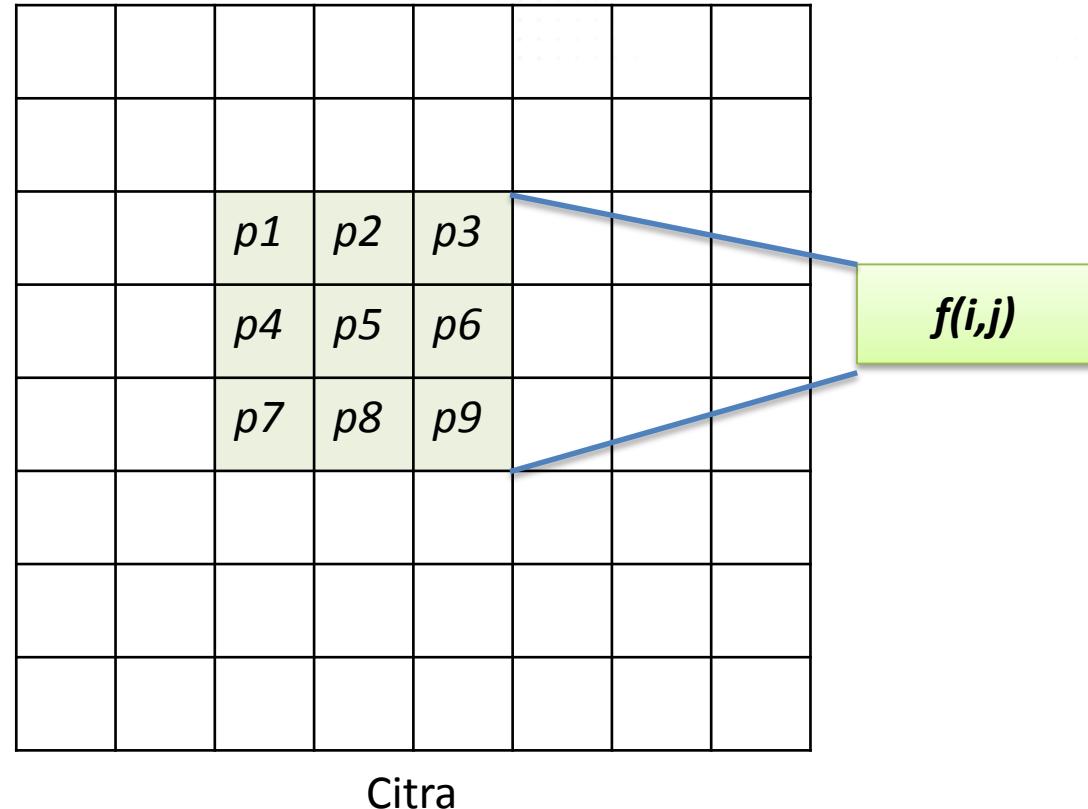
$$g(x, y) = h(-1, -1)f(x - 1, y - 1) + h(-1, 0)f(x -$$

$$g(x, y) = \sum_{i=-1}^1 \sum_{j=-1}^1 h(i, j)f(x + i, y + j)$$

Ilustrasi Konvolusi

A	B	C
D	E	F
G	H	I

Kernel



$$f(i,j) = Ap1 + Bp2 + Cp3 + Dp4 + Ep5 + Fp6 + Gp7 + Hp8 + Ip9$$

Citra dengan 5×5 pixel dan 8 grayscale :

0	5	5	4	4
0	0	5	4	4
1	6	-1	3	3
1	6	7	2	3
1	6	7	6	6



Dikonvolusi dengan
image mask :



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

Hasilnya :

Hasil konvolusi = $(0 \times -2) + (5 \times -1) + (5 \times 0) + (0 \times -1) + (0 \times 0) + (5 \times 1) + (1 \times 0) + (6 \times 1) + (1 \times 2) = 8$

- Referred to low-pass filters
- Reduce sharp transition in intensities
- Reduce noise
- Reduce "irrelevant" details in the image
- Blur edges

- Replace each pixel with the average of itself and its neighbours
- The kernel W contains only 1s
- The result is divided by the sum of the weights, i.e., with $\frac{1}{9}$
- 3×3 kernel

$$W = \frac{1}{9} * \begin{array}{|c|c|c|}\hline 1 & 1 & 1 \\ \hline 1 & 1 & 1 \\ \hline 1 & 1 & 1 \\ \hline \end{array}$$

- Fast operation for small neighbourhoods
- Differing pixel values will become more like their neighbours:
 - + Noise is reduced
 - Sharp edges are blurred

Hasil Output Mean Filter

Original image



Original image



Mean Filtering image



Mean Filtering image



Median Filter

- Digunakan untuk menghilangkan noise
- Menggunakan nilai tengah dari pixel-pixel yang tertutup filter

6	6	6	6	6
6	7	6	6	6
6	6	8	6	6
6	6	6	6	6
6	3	6	6	6

6 6 6 6 6 6 7 8

Median sebagai nilai pengganti

Hasil Output *Median Filter*

Original image with noise



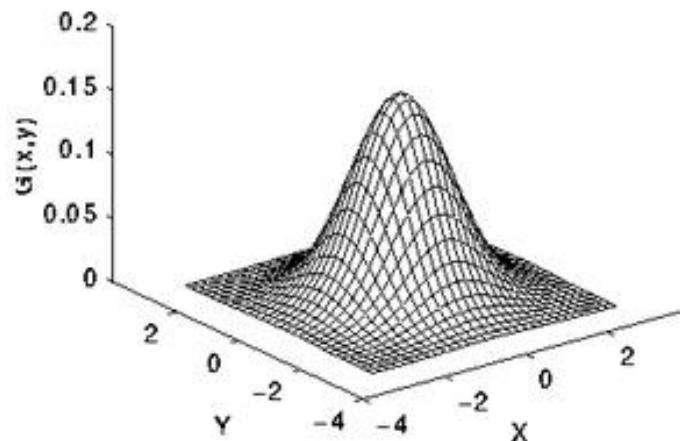
Median Filtering image



Sifat-sifat filter atau mask

- Elemenya adalah berdistribusi Gaussian dan seluruh elemennya berjumlah 1
- Filter Gaussian setidaknya berukuran 5x5
- Semua nilai elemennya adalah positip, berikut adalah mask Gaussian filter 5x5 dengan $\sigma = 1$

$$G(x, y) = \frac{1}{2\pi\sigma^2} e^{-\frac{x^2+y^2}{2\sigma^2}}$$



σ adalah standar deviasi
pusat (x,y) adalah pusat piksel, pusat(0,0)
mendapat bobot terbesar 1

$$\frac{1}{273}$$

1	4	7	4	1
4	16	26	16	4
7	26	41	26	7
4	16	26	16	4
1	4	7	4	1

filter 5x5 dengan $\sigma = 1$

$$G(x,y) = \frac{1}{2\pi\sigma^2} e^{-\frac{x^2+y^2}{2\sigma^2}}$$

- $G(0,0) = e^{-0} = 1$
- $G(1,0) = G(0,1) = G(-1,0) = G(0,-1) = e^{-1/2} = 0.6065$
- $G(1,1) = G(1,-1) = G(-1,1) = G(-1,-1) = e^{-1} = 0.3679$
- $G(2,1) = G(1,2) = G(-2,1) = G(-2,-1) = e^{-(5/2)} = 0.0821$
- $G(2,0) = G(0,2) = G(0,-2) = G(-2,0) = e^{-2} = 0.1353$
- $G(2,2) = G(-2,-2) = G(-2,2) = G(2,-2) = e^{-4} = 0.0183$

1	3	6	3	1
3	15	25	15	3
6	25	41	25	6
3	15	25	15	3
1	3	6	3	1

Contoh : Ketika mengalikan nilai $G(x,y)$ di depan dengan 41 dan dibulatkan ke atas

$$G(0,0) = 1 * 41 = \textcolor{red}{41}$$

$$G(1,0) = G(0,1) = G(-1,0) = G(0,-1) = 0.6065 * 41 = \textcolor{brown}{25}$$

$$G(1,1) = G(1,-1) = G(-1,1) = G(-1,-1) = 0.3679 * 41 = \textcolor{brown}{15}$$

$$G(2,1) = G(1,2) = G(-2,1) = G(-2,-1) = 0.0821 * 41 = \textcolor{blue}{3}$$

$$G(2,0) = G(0,2) = G(0,-2) = G(-2,0) = 0.1353 * 41 = \textcolor{blue}{6}$$

$$G(2,2) = G(-2,-2) = G(-2,2) = G(2,-2) = 0.0183 * 41 = \textcolor{blue}{1}$$

Hasil Output *Gaussian Filter*

Original image



Original image



Original image



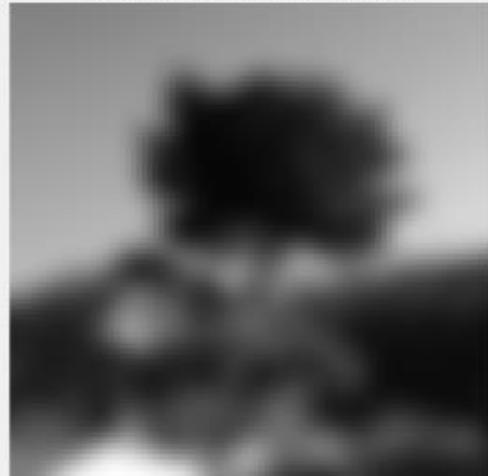
Gaussian Filtering image, sigma=1



Gaussian Filtering image, sigma=2



Gaussian Filtering image, sigma=5



- Filter penghalusan (smoothing) akan menghilangkan kedekatan dari citra hasil pemfilteran.
- *Sharpening spatial filter* akan meningkatkan kedekatan kenampakan citra
 - Menghilangkan keburaman (blurring) pada citra
 - Menonjolkan tepi
- Filter sharpening didasarkan pada diferensiasi spasial (***spatial differentiation***)

Turunan pertama dari fungsi

$$\frac{\partial f}{\partial x} = f(x+1) - f(x)$$

Turunan kedua dari fungsi

$$\frac{\partial^2 f}{\partial^2 x} = f(x+1) + f(x-1) - 2f(x)$$

Turunan Kedua Digunakan untuk Perbaikan Citra (*Image Enhancement*)

- Turunan kedua digunakan untuk perbaikan citra dikarenakan memiliki respon yang baik untuk meningkatkan kedekatan (sharpening) dan implementasinya yang sederhana

Laplacian didefinisikan sbg:

$$\nabla^2 f = \frac{\partial^2 f}{\partial^2 x} + \frac{\partial^2 f}{\partial^2 y}$$

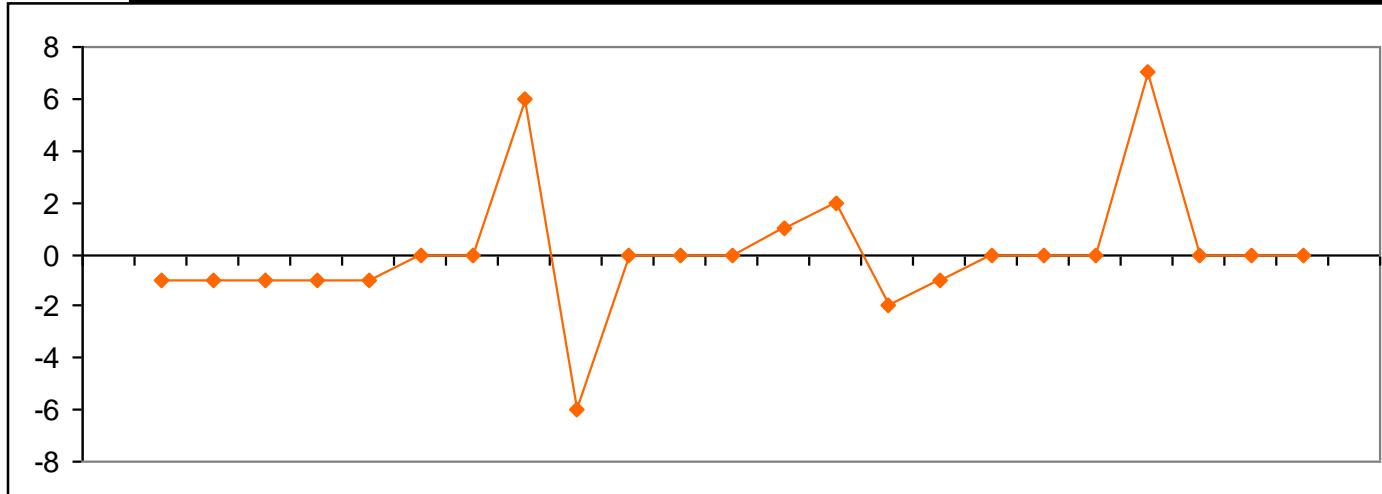
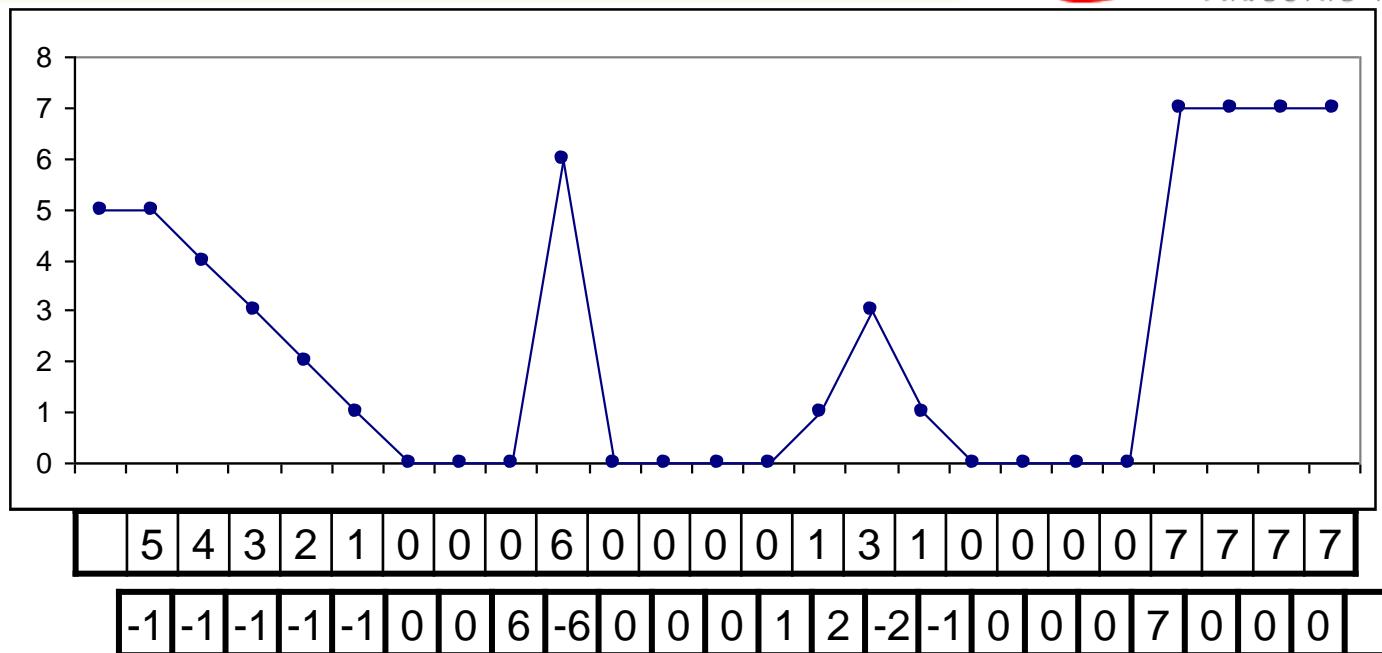
Turunan parsial dalam arah **x** didefinisikan sbb. :

$$\frac{\partial^2 f}{\partial^2 x} = f(x+1, y) + f(x-1, y) - 2f(x, y)$$

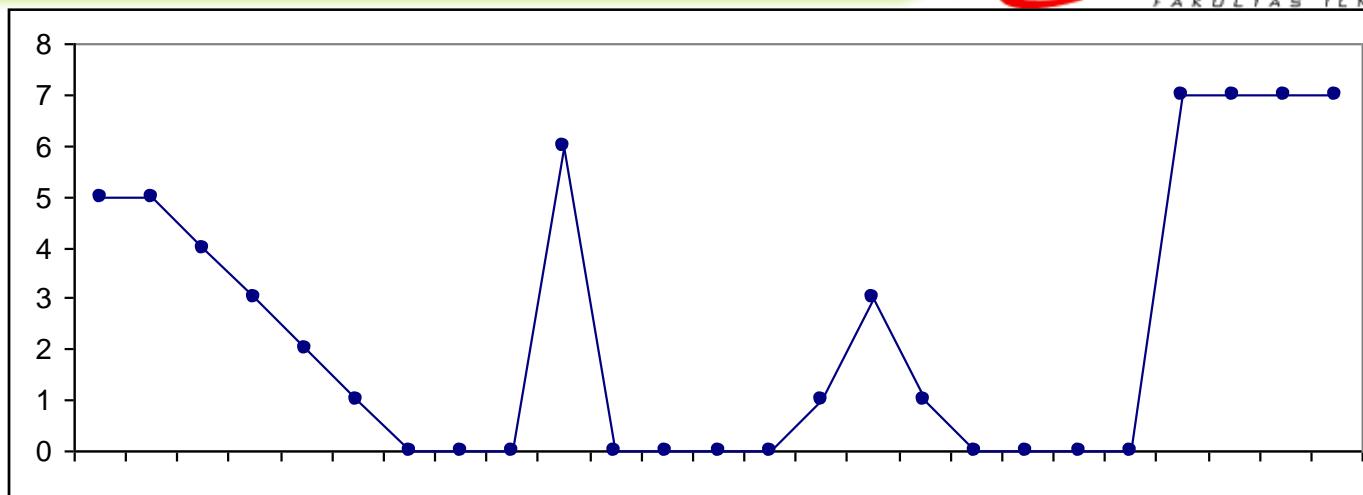
Dan dalam arah **y** adalah:

$$\frac{\partial^2 f}{\partial^2 y} = f(x, y+1) + f(x, y-1) - 2f(x, y)$$

Turunan Pertama

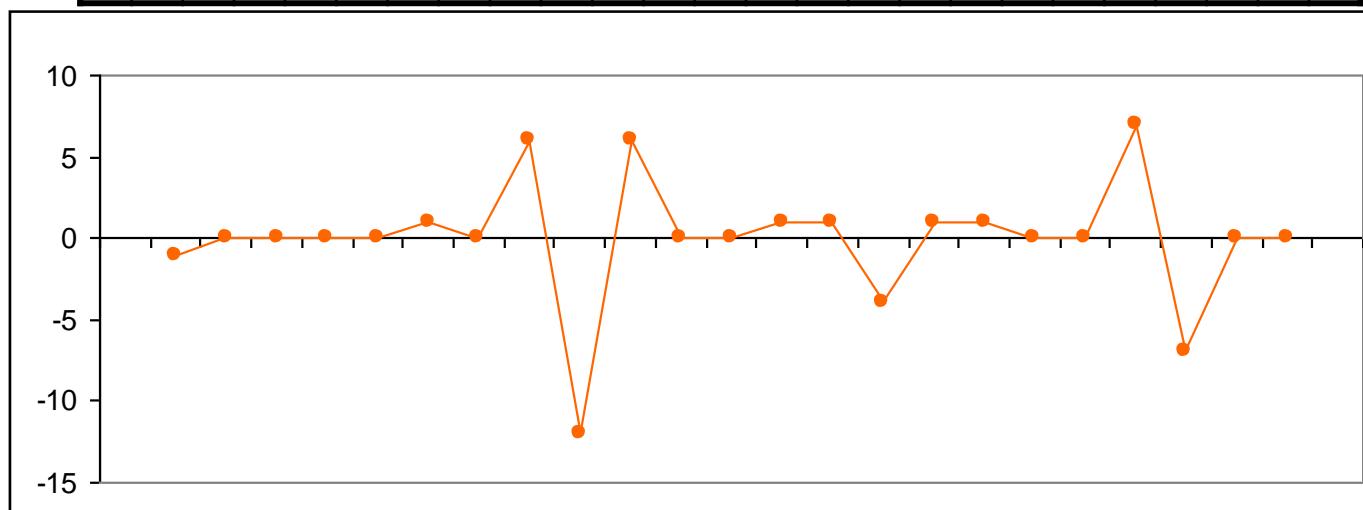


Turunan Kedua



5	5	4	3	2	1	0	0	0	6	0	0	0	0	1	3	1	0	0	0	0	7	7	7	7
---	---	---	---	---	---	---	---	---	---	---	---	---	---	---	---	---	---	---	---	---	---	---	---	---

-1	0	0	0	0	0	1	0	6	-12	6	0	0	1	1	-4	1	1	0	0	7	-7	0	0
----	---	---	---	---	---	---	---	---	-----	---	---	---	---	---	----	---	---	---	---	---	----	---	---



Laplacian dapat dibentuk sbb:

$$\begin{aligned}\nabla^2 f = & [f(x+1, y) + f(x-1, y) \\& + f(x, y+1) + f(x, y-1)] \\& - 4f(x, y)\end{aligned}$$

Berdasarkan formula tersebut dapat dibentuk spasial filter sbb.:

0	1	0
1	-4	1
0	1	0

Laplacian Image Enhancement

The diagram illustrates the Laplacian image enhancement process. It consists of three grayscale images of a moon against a black background. A minus sign between the first two images indicates subtraction, and an equals sign follows the second image. Below each image is a caption in Indonesian:

- Citra asli (Original image)
- Citra terfilter Laplacian (Laplacian filtered image)
- Citra akhir yg Lbh tajam kenampakannya (Final image which appears sharper)

$$g(x, y) = f(x, y) - \nabla^2 f$$

Pada citra hasil akhir, batas tepi dan kedekatan unsur tampak lebih jelas

Laplacian Image Enhancement



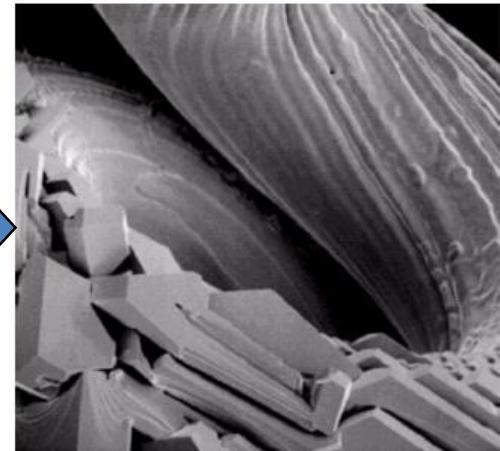
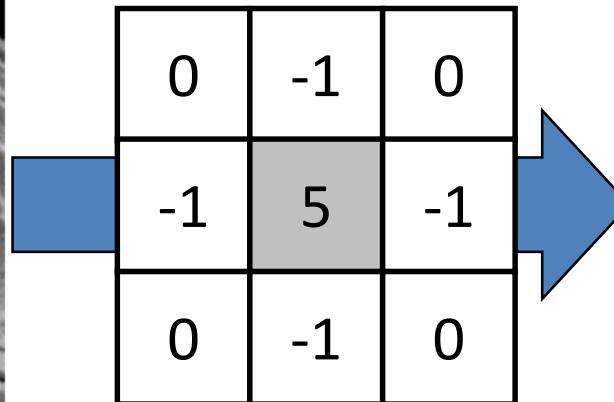
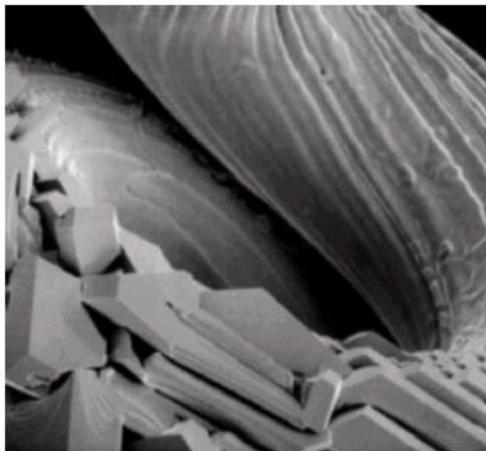
Penyederhanaan Perbaikan Citra *(Filter Laplacian)*

Seluruh proses pada slide sebelumnya dapat dikombinasikan menjadi operasi filter tunggal:

$$\begin{aligned}g(x, y) &= f(x, y) - \nabla^2 f \\&= f(x, y) - [f(x+1, y) + f(x-1, y) \\&\quad + f(x, y+1) + f(x, y-1) - 4f(x, y)] \\&= 5f(x, y) - f(x+1, y) - f(x-1, y) \\&\quad - f(x, y+1) - f(x, y-1)\end{aligned}$$

Penyederhanaan Perbaikan Citra (Filter Laplacian)

Filter spasial baru yg menggabungkan seluruh operasi menjadi operasi filter tunggal:



Varian Pada Filter Laplacian Sederhana

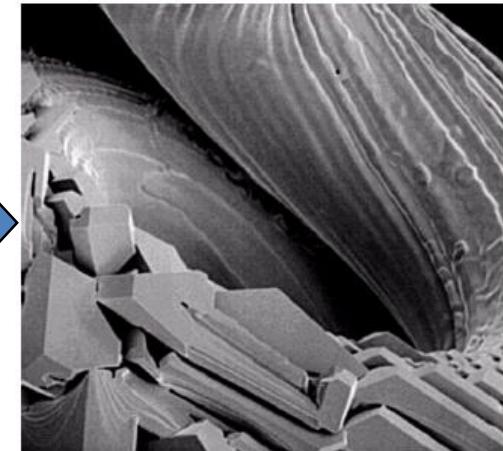
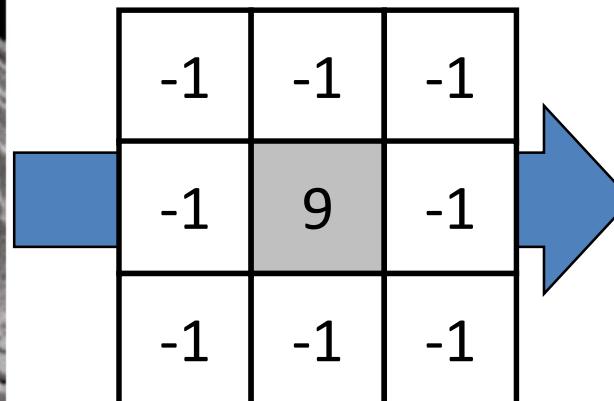
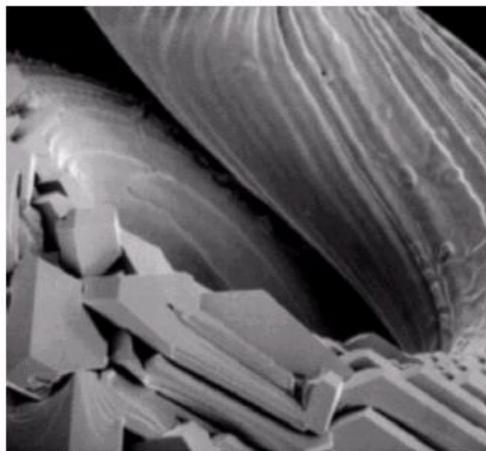
Beberapa jenis varian dr filter laplacian:

0	1	0
1	-4	1
0	1	0

Simple
Laplacian

1	1	1
1	-8	1
1	1	1

Variant of
Laplacian



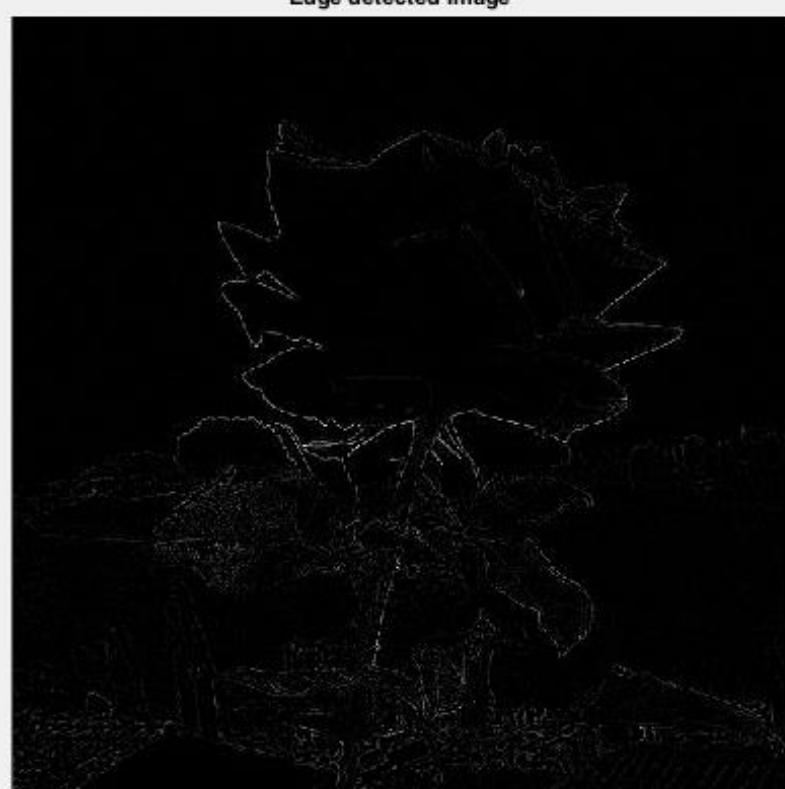
- + Rotation invariant; needs only one convolution mask
- Responds doubly to some edges
- Noise sensitive

0	1	0
1	-4	1
0	1	0

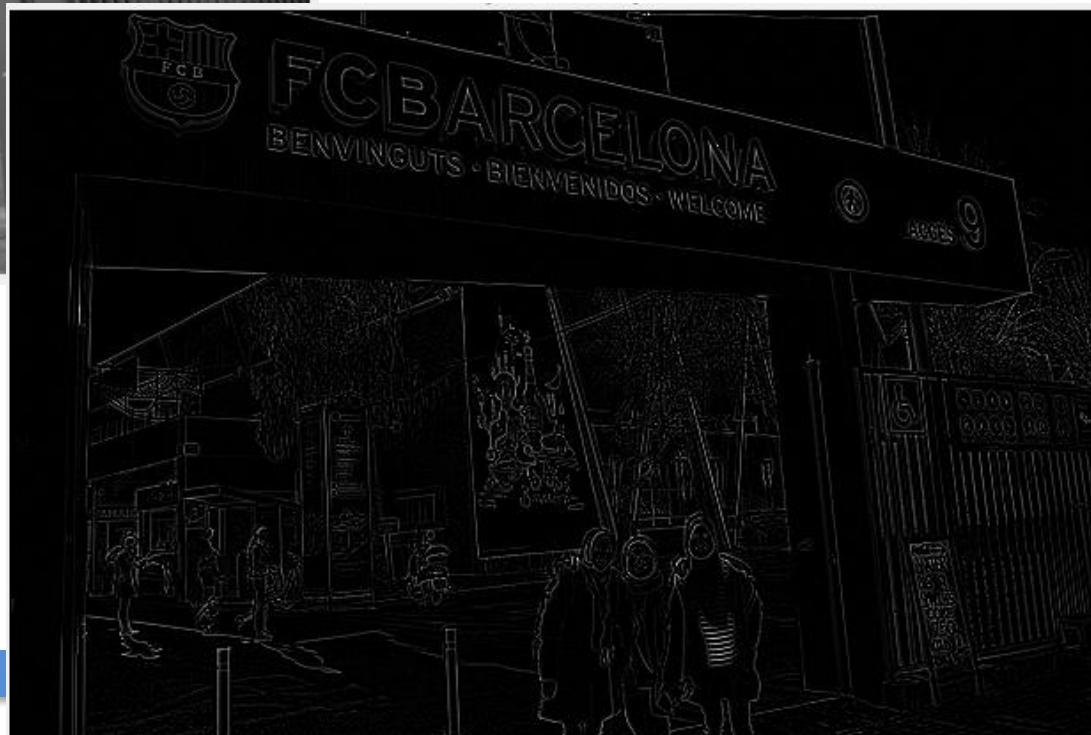
1	1	1
1	-8	1
1	1	1

-1	2	-1
2	-4	2
-1	2	-1

Hasil dari *Laplacian Filter*



Hasil dari *Laplacian Filter*



Filter Turunan Pertama (*1st Derivative Filtering*)

Implementasi turunan filter pertama sulit untuk diaplikasikan fungsi $f(x, y)$, gradien dari f pd koordinat (x, y) diberikan sebagai vektor kolom:

$$\nabla f = \begin{bmatrix} G_x \\ G_y \end{bmatrix} = \begin{bmatrix} \frac{\partial f}{\partial x} \\ \frac{\partial f}{\partial y} \end{bmatrix}$$

magnitut dari vektor ini diberikan sbb:

$$\begin{aligned}\nabla f &= \text{mag}(\nabla f) \\ &= [G_x^2 + G_y^2]^{1/2} \\ &= \left[\left(\frac{\partial f}{\partial x} \right)^2 + \left(\frac{\partial f}{\partial y} \right)^2 \right]^{1/2}\end{aligned}$$

Untuk alasan praktis dapat disederhanakan sbb:

$$\nabla f \approx |G_x| + |G_y|$$

Gradien dapat dihitung sbb:

$$\nabla f \approx |(z_7 + 2z_8 + z_9) - (z_1 + 2z_2 + z_3)| \\ + |(z_3 + 2z_6 + z_9) - (z_1 + 2z_4 + z_7)|$$

Yang didasarkan pada koordinat sbb.

z_1	z_2	z_3
z_4	z_5	z_6
z_7	z_8	z_9

Operasi Sobel

Berdasarkan persamaan sebelumnya, dapat diturunkan operasi sobel:

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

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

Pada citra diaplikasikan masing-masing filter kemudian hasilnya ditambahkan.

Contoh Perhitungan Operasi Sobel

- Consider a matrix A with size 4x4

$$\begin{bmatrix} 1 & 2 & 2 & 1 \\ 1 & 1 & 0 & 3 \\ 2 & 4 & 1 & 5 \\ 2 & 1 & 2 & 0 \end{bmatrix}$$

- Consider the elements in the window 3x3
- Find the x-direction derivative: Subtract the first row from the Third row using the mask.

$$\begin{bmatrix} 1 & 2 & 2 \\ 1 & 1 & 0 \\ 2 & 4 & 1 \end{bmatrix}$$

$$G_x = (z_7 + 2z_8 + z_9) - (z_1 + 2z_2 + z_3)$$

$$G_x(1,1) = (2 + (2 * 4) + 1) - (1 + (2 * 2) + 2) = 4$$

Contoh Perhitungan Operasi Sobel

- Find the y-direction derivative: Subtract the first column from the Third column using the mask.

$$Gy = (z_3 + 2z_6 + z_9) - (z_1 + 2z_4 + z_7)$$

$$Gy(1,1) = (2 + (2*0) + 1) - (1 + (2*1) + 2) = -2$$

- Find the Gradient:

$$Gx^2 = 16, \quad Gy^2 = 4$$

$$\Delta f = [16+4]^{1/2} = (20)^{1/2}, \text{ ie. } f(1,1) = 4.4721.$$

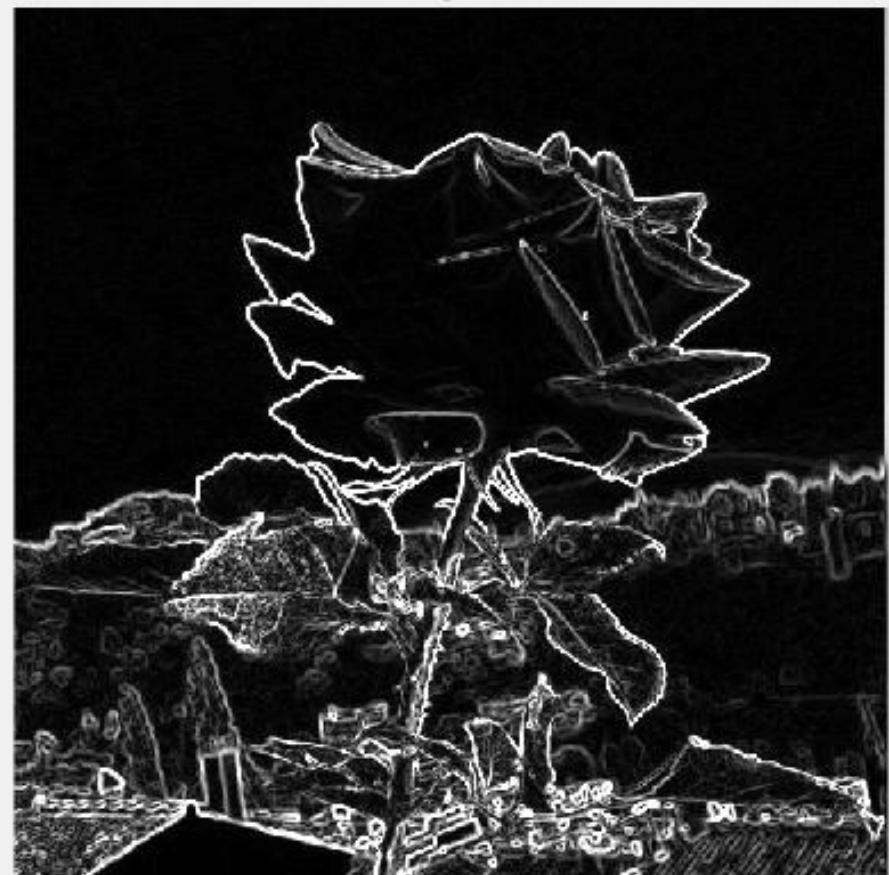
The procedure is done for the whole image matrix.

Contoh Hasil Operasi Sobel

original image



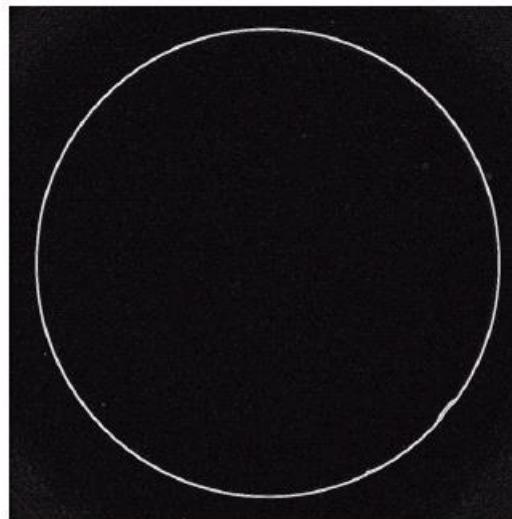
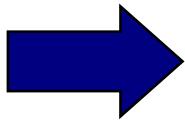
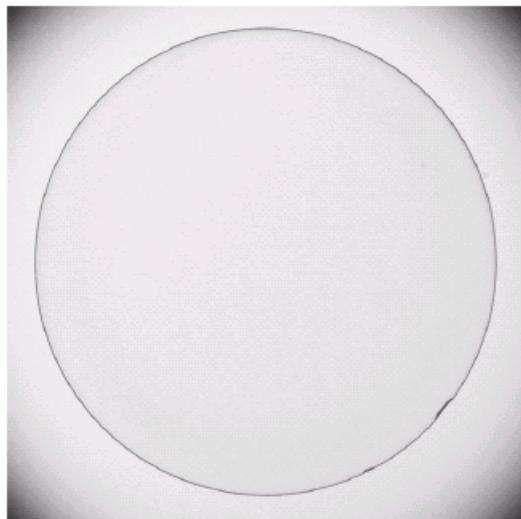
Sobel gradient



Contoh Hasil Operasi Sobel



Contoh Hasil Operasi Sobel



Citra kontak lens,
diaplikasikan filter utk
mendeteksi cacat pd
pinggirnya

Filter Sobel digunakan untuk deteksi tepi.

Thank You.....