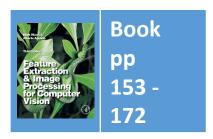
# Lecture 7 Further Edge Detection

COMP3204 & COMP6223 Computer Vision

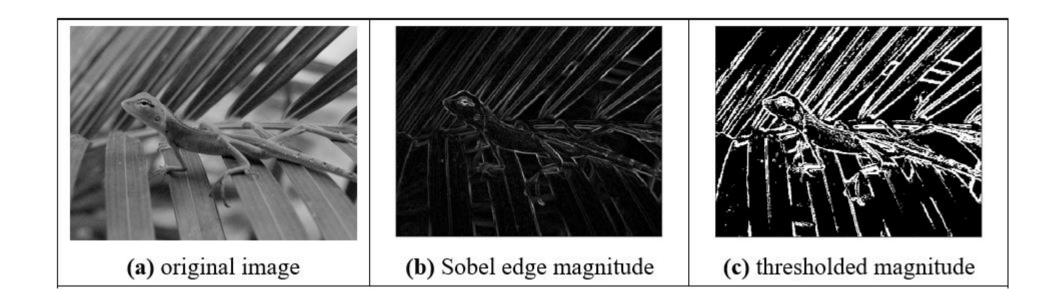
What better ways are there to detect edges?



Department of Electronics and Computer Science

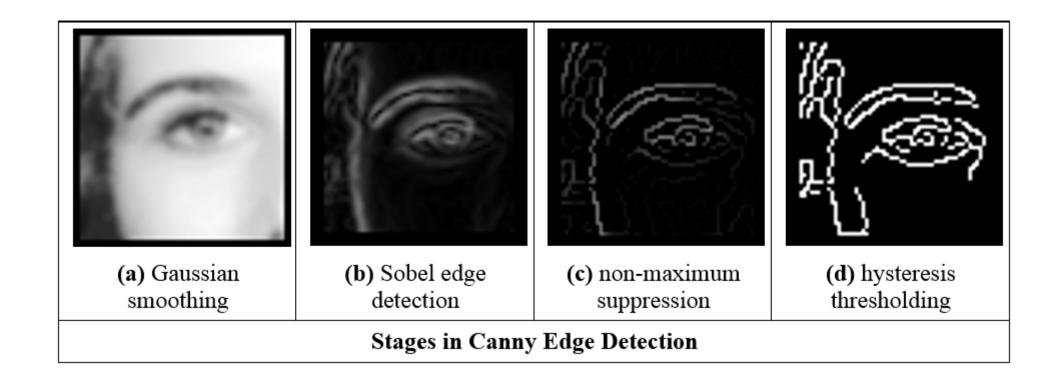


# Applying Sobel operator





## Stages in Canny edge detection operator





#### Canny edge detection operator

#### Formulated with three main objectives:

- optimal detection with no spurious responses;
- good localisation with minimal distance between detected and true edge position; and
- single response to eliminate multiple responses to a single edge.

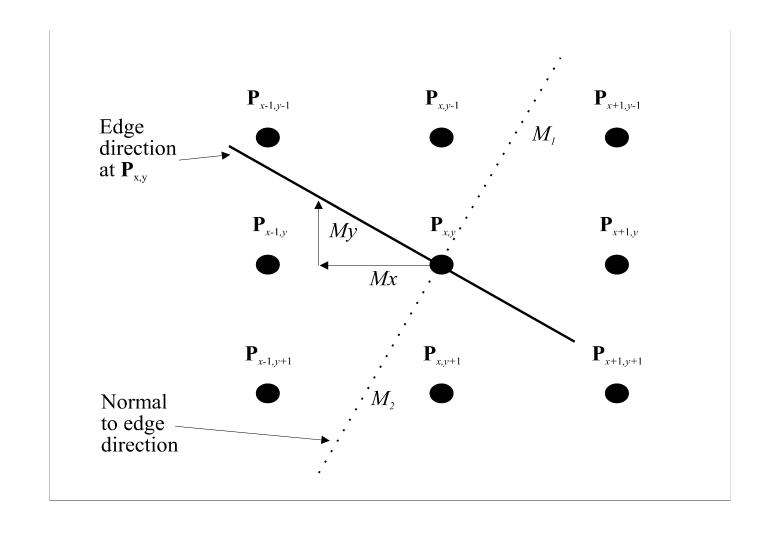
#### **Approximation**

- use Gaussian smoothing;
- 2. use the Sobel operator;
- combine?
- 3. use non-maximal suppression; and
- 4. threshold with hysteresis to connect edge points.



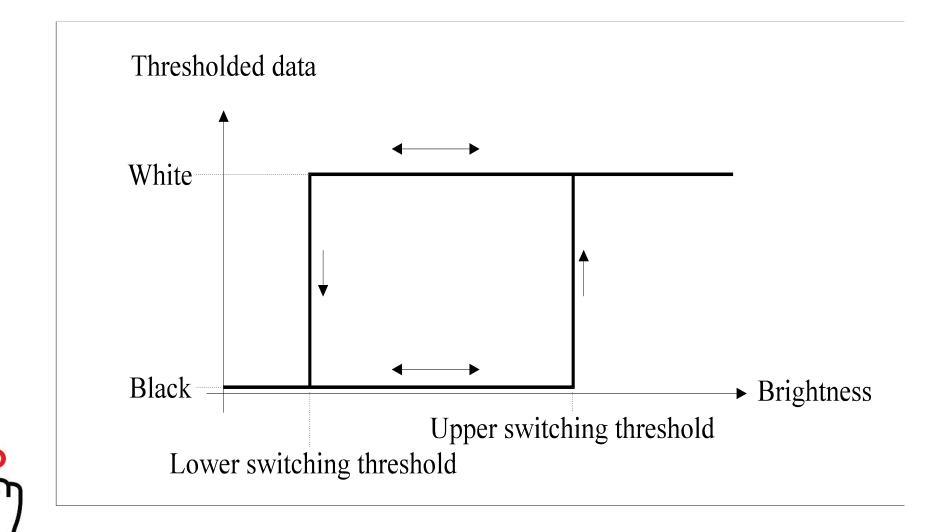


## Interpolation in non-maximum suppression



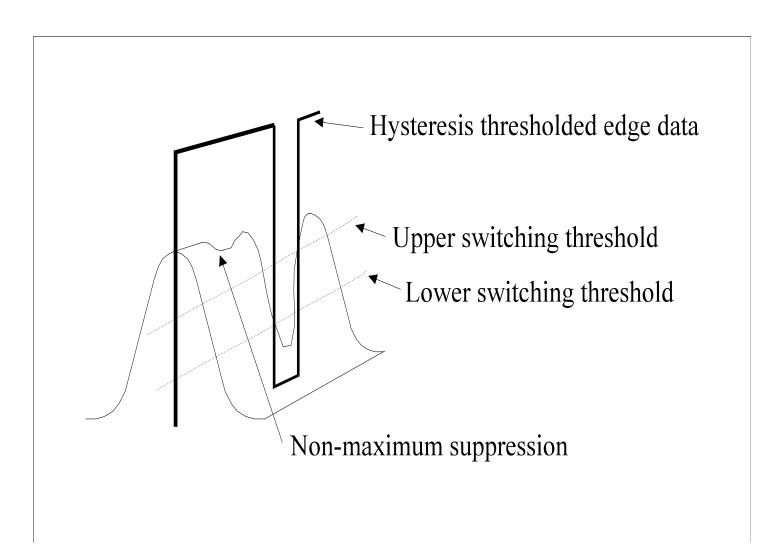


# Hysteresis thresholding transfer function





# Action of non-maximum suppression and hysteresis thresholding





# Comparing hysteresis thresholding with uniform thresholding



(a) hysteresis thresholding, upper level = 40, lower level = 10



**(b)** uniform thresholding, level = 40

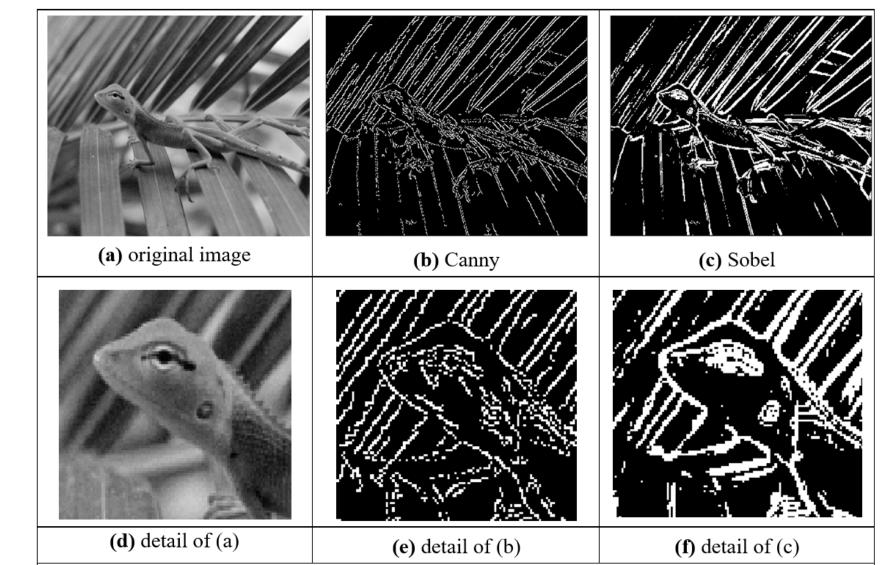


(c) uniform thresholding, level = 10





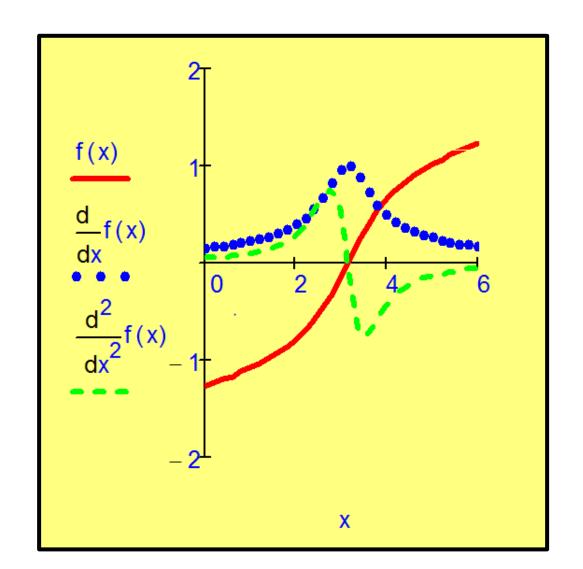
# Comparing Canny with Sobel







# First and second order edge detection





# Edge detection via the Laplacian operator

0	-1	0
-1	4	-1
0	-1	0

1	2	3	4	1	1	2	1	0	0	0	0	0	0	0	0
2	2	3	0	1	2	2	1	0	1	-31	-47	-36	-32	0	0
3	0	38	39	37	36	3	0	0	-44	70	37	31	60	-28	0
4	1	40	44	41	42	2	1	0	-42	34	12	1	50	-41	0
1	2	43	44	40	39	3	1	0	-37	47	8	-6	31	-32	0
2	0	39	41	42	40	2	0	0	-45	72	37	45	74	-36	0
0	2	0	2	2	3	1	1	0	6	-44	-38	-40	-31	-6	0
0	2	1	3	1	0	4	2	0	0	0	0	0	0	0	0
	(a) image data						(b) result of the Laplacian operator								





# Mathbelts on...

$$\nabla^{2}g(x,y) = \frac{\partial^{2}g(x,y,\sigma)}{\partial x^{2}}U_{x} + \frac{\partial^{2}g(x,y,\sigma)}{\partial y^{2}}U_{y}$$

$$= \frac{\partial\nabla g(x,y,\sigma)}{\partial x}U_{x} + \frac{\partial\nabla g(x,y,\sigma)}{\partial y}U_{y}$$

$$= \left(\frac{x^{2}}{\sigma^{2}} - 1\right)\frac{e^{\frac{-(x^{2}+y^{2})}{2\sigma^{2}}}}{\sigma^{2}} + \left(\frac{y^{2}}{\sigma^{2}} - 1\right)\frac{e^{\frac{-(x^{2}+y^{2})}{2\sigma^{2}}}}{\sigma^{2}}$$

$$= \frac{1}{\sigma^{2}}\left(\frac{(x^{2}+y^{2})}{\sigma^{2}} - 2\right)e^{\frac{-(x^{2}+y^{2})}{2\sigma^{2}}}$$

# Top 3 hits Google: "Lalpacian of Gaussian"

$$LoG(x,y) = -\frac{1}{\pi\sigma^4} \left[ 1 - \frac{x^2 + y^2}{2\sigma^2} \right] e^{-\frac{x^2 + y^2}{2\sigma^2}}$$

$$LoG \stackrel{\triangle}{=} \triangle G_{\sigma}(x,y) = \frac{\partial^2}{\partial x^2} G_{\sigma}(x,y) + \frac{\partial^2}{\partial y^2} G_{\sigma}(x,y) = \frac{x^2 + y^2 - 2\sigma^2}{\sigma^4} e^{-(x^2 + y^2)/2\sigma^2}$$

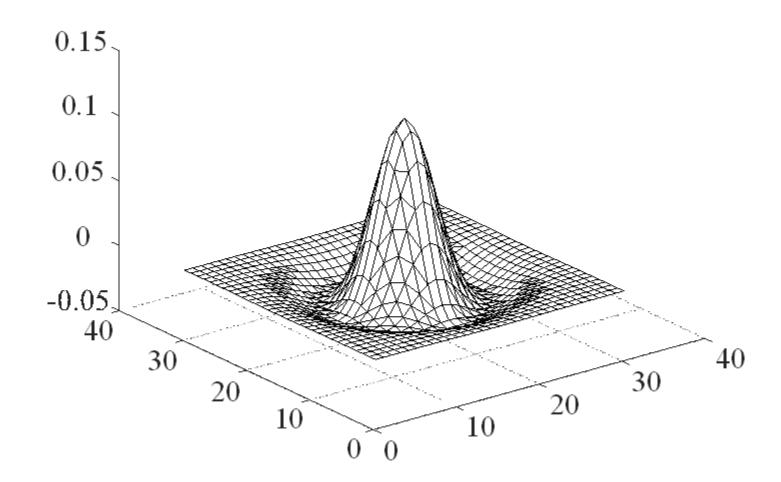
LoG(x,y) = 
$$-\frac{1}{\pi\sigma^4} \left[ 1 - \frac{x^2 + y^2}{2\sigma^2} \right] e^{-\frac{x^2 + y^2}{2\sigma^2}}$$

Two wrong, one right. Just one.....why?

(and two of them don't even work!!)

http://homepages.inf.ed.ac.uk/rbf/HIPR2/log.htm; http://fourier.eng.hmc.edu/e161/lectures/gradient/node8.html; http://academic.mu.edu/phys/matthysd/web226/Lab02.htm

# Shape of Laplacian of Gaussian operator



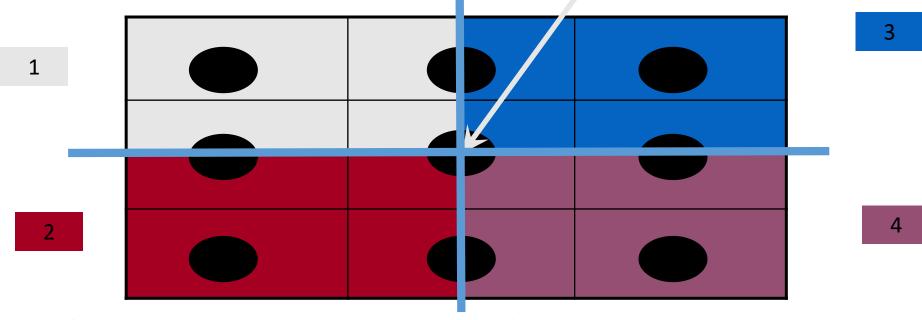


## Zero crossing detection

• Basic – straight comparison

f(x, y)

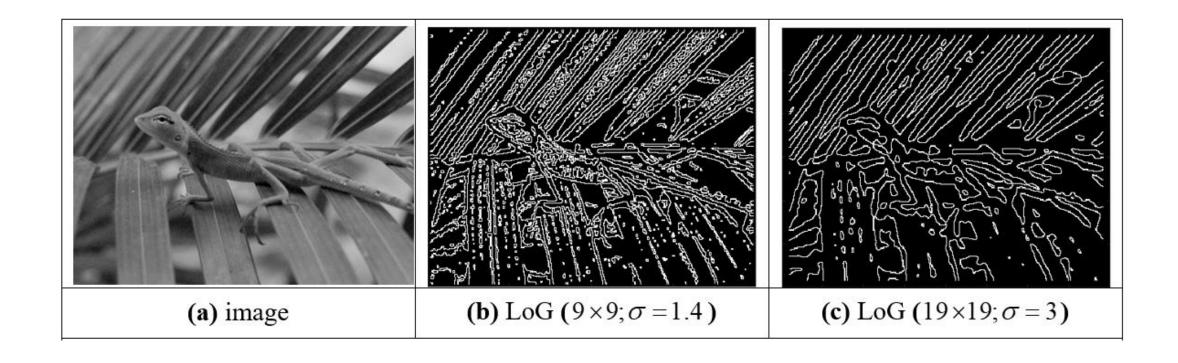
Advanced





$$IF(\max(1,2,3,4) > 0 \land \min(1,2,3,4) < 0)$$
  $THEN$   $f(x, y) = edge$ 

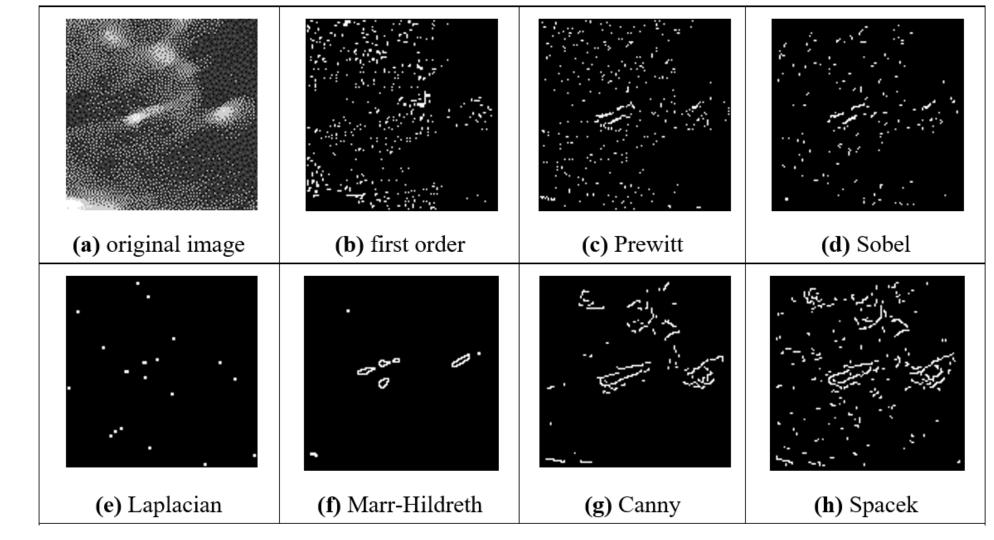
# Marr-Hildreth edge detection







# Comparison of edge detection operators







## Newer stuff - phase congruency

• Immune to overall change in brightness (wow!!)



(a) modified cameraman image



**(b)** edges by the Canny operator

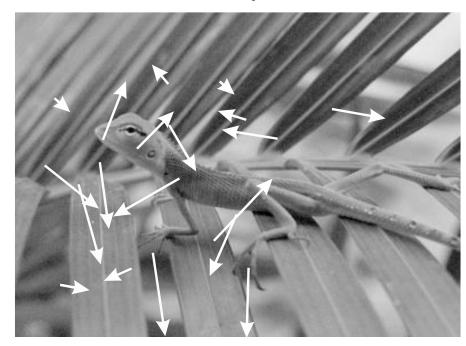


(c) phase congruency



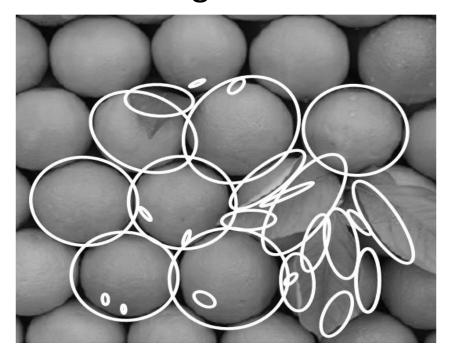
#### Newer stuff – interest detections

#### feature points



SIFT (mega famous) (wait for Jon)

regions



brightness clustering

(excellent, but confess its ours)



Lomeli-R. and Nixon and Carter, Mach Vis Apps 2016