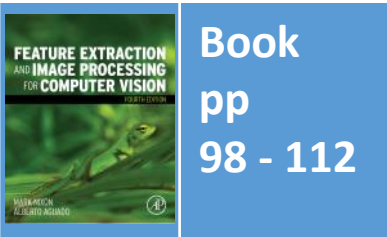


# Lecture 5 Group Operators

COMP3204 & COMP6223 Computer Vision

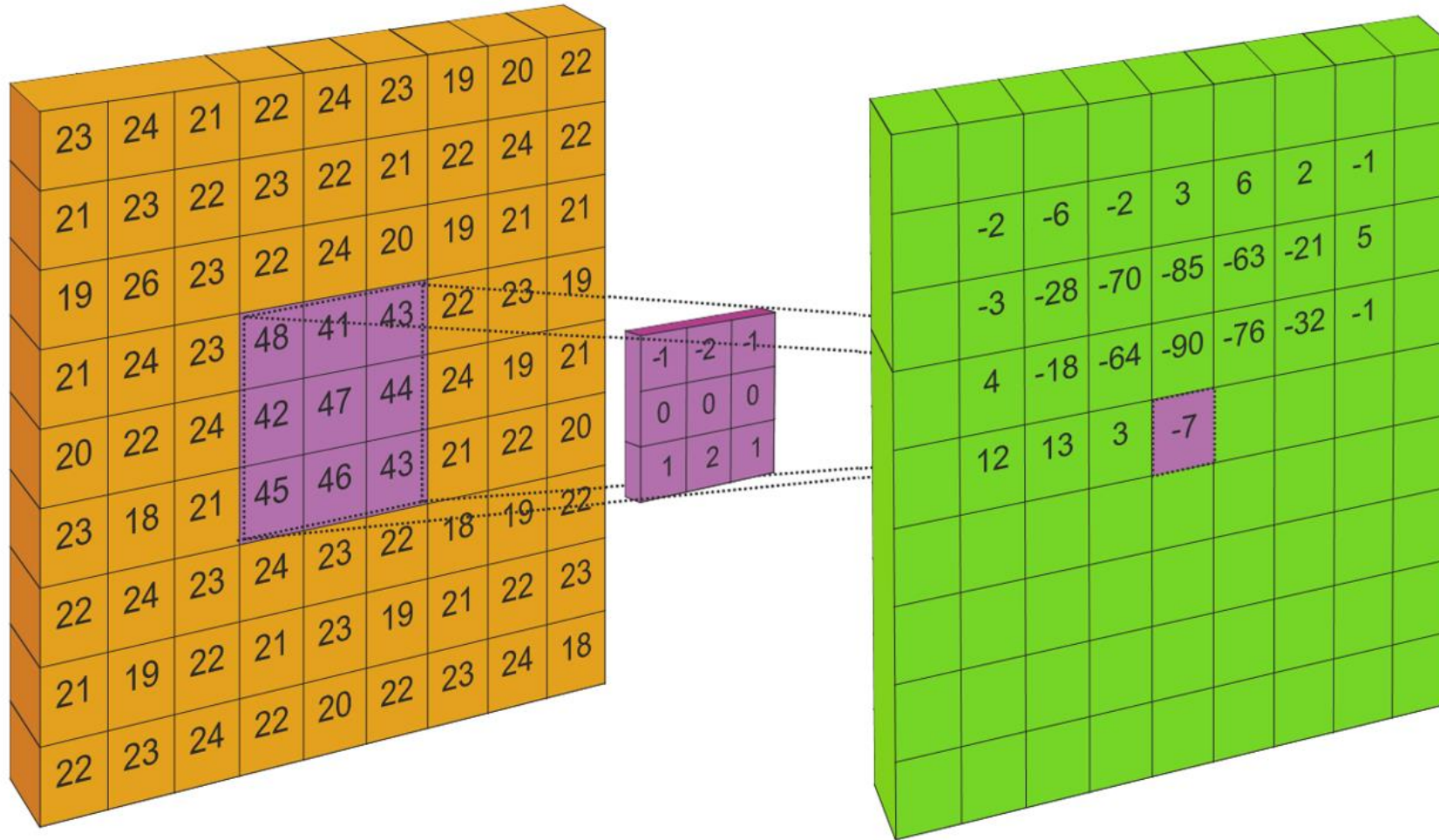
**How do we combine points to make a new point in a new image?**



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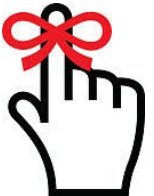
# Template convolution



Original image

Convolution template

Result image



# Template convolution

Image

100	100	200	200	200
100	100	200	200	200
100	100	200	200	200
200	200	400	400	400
300	300	400	400	400

0	0	0	0	0
0	400	400	0	0
0	400	400	0	0
0	400	400	0	0
0	0	0	0	0

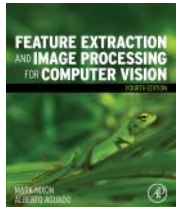
$G_y$

Result

0	0	0	0	0
0	400	400	0	0
0	640	806	800	0
0	894	894	800	0
0	0	0	0	0

0	0	0	0	0
0	0	0	0	0
0	500	700	800	0
0	800	800	800	0
0	0	0	0	0

$G_x$



# Template convolution

- Convolution is a **system response**

$$\text{convolution} = f * g = \int_{-\infty}^{\infty} f(t) g(t - \tau) d\tau$$

- Template convolution includes **coordinate inversion** in  $x$  and in  $y$

$$(\mathbf{T} * \mathbf{I})_{i,j} = \sum_{x \in \text{template}} \sum_{y \in \text{template}} \mathbf{T}_{i+m-x, j+m-y} \mathbf{I}_{i+x, j+y}$$

- Inversion is **not needed** if the template is **symmetric**

see the code!!



## 3x3 template and weighting coefficients

$w_0$	$w_1$	$w_2$
$w_3$	$w_4$	$w_5$
$w_6$	$w_7$	$w_8$

$$\mathbf{N}_{x,y} = \sum_{i \in \text{template}} \sum_{j \in \text{template}} w_{i,j} \times \mathbf{O}_{x(i),y(j)}$$

where  $w_{i,j}$  are the weights and  $x(i), y(j)$  denote the position of the point that matches the weighting coefficient position



# 3×3 averaging operator

$$N_{x,y} = \frac{1}{9} \sum_{i \in 3} \sum_{j \in 3} o_{x(i),y(j)}$$

1/9	1/9	1/9
1/9	1/9	1/9
1/9	1/9	1/9



# Illustrating the effect of window size



3×3



5×5



7×7



# Template convolution via the Fourier transform

Allows for **fast computation** for template size  $\geq 7 \times 7$

$$\mathbf{P} * \mathbf{T} = \mathfrak{F}^{-1} \left( \mathfrak{F}(\mathbf{P}) \cdot \mathfrak{F}(\mathbf{T}) \right)$$

Template convolution \*

Fourier transform of the picture,  $\mathfrak{F}(\mathbf{P})$

Fourier transform of the template,  $\mathfrak{F}(\mathbf{T})$

Point by point multiplication ( $\cdot$ ).



Beware of clowns ... Oxford

Imperial

$$f(x, y) * h(x, y) \Leftrightarrow F(u, v)H(u, v)$$


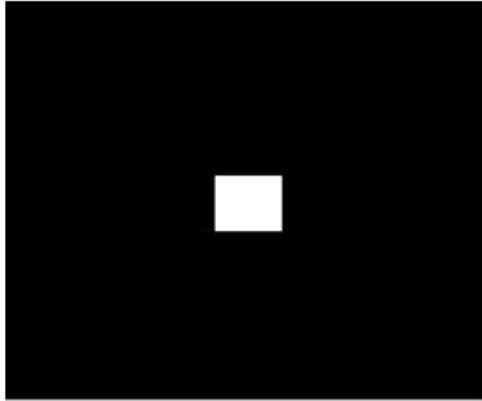

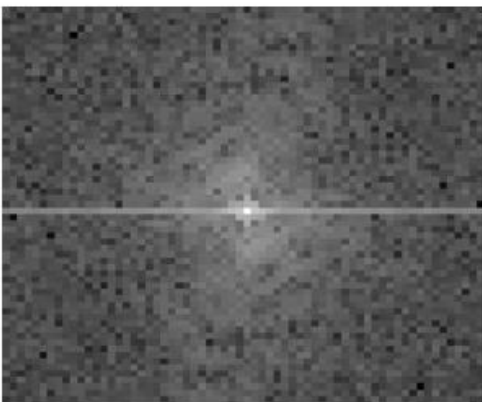
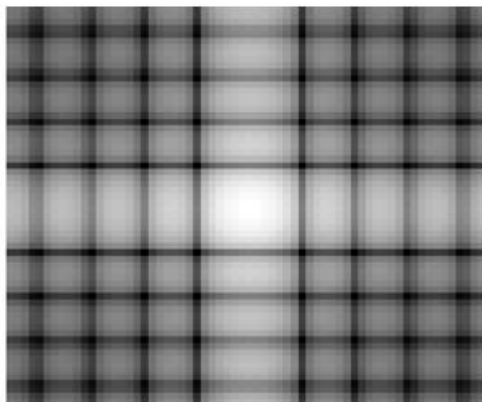
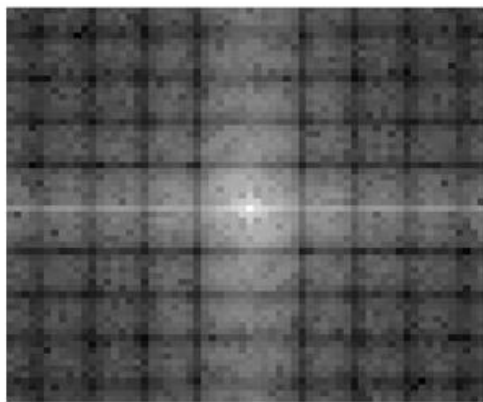
$$w(t) = u(t) * v(t) \Leftrightarrow W(f) = U(f)V(f)$$

it's point by point!!





# Template Convolution via the Fourier Transform

		
(a) image of eye	(b) padded averaging template	(c) resulting averaged image
		
(d) image transform	(e) template transform	(f) multiplied transforms



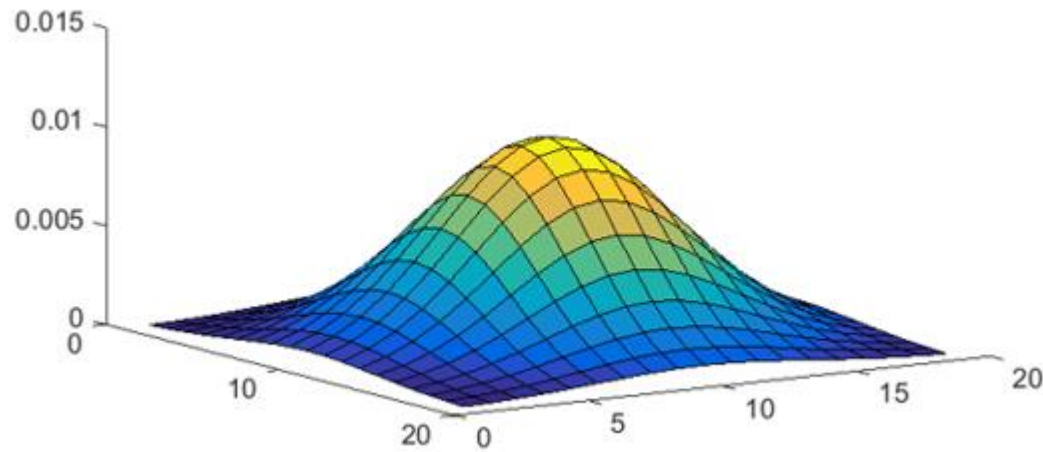
# 2D Gaussian function

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

- Used to calculate **template** values
- Note **compromise** between **variance**  $\sigma^2$  and **window size**
- Common choices 5×5, 1.0; 7×7, 1.2; 9×9, 1.4

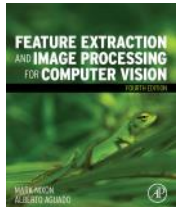


# 2D Gaussian function and template



0.002	0.013	0.022	0.013	0.002
0.013	0.060	0.098	0.060	0.013
0.022	0.098	0.162	0.098	0.022
0.013	0.060	0.098	0.060	0.013
0.002	0.013	0.022	0.013	0.002

### Template for the $5 \times 5$ Gaussian Averaging Operator ( $\sigma = 1.0$ ).



# Applying Gaussian averaging



(a)  $3 \times 3$



(b)  $5 \times 5$



(c)  $7 \times 7$



# Finding the median from a 3×3 template

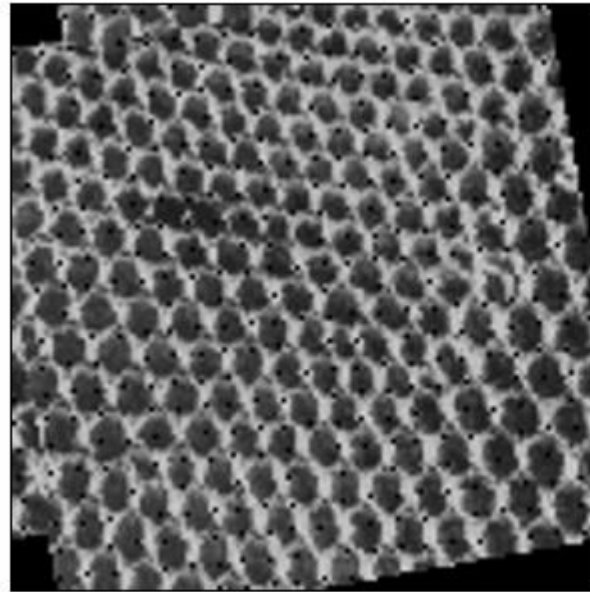
<table><tr><td>2</td><td>8</td><td>7</td></tr><tr><td>4</td><td>0</td><td>6</td></tr><tr><td>3</td><td>5</td><td>7</td></tr></table> <p><b>(a)</b> 3 × 3 region</p>	2	8	7	4	0	6	3	5	7	<table><tr><td>2</td><td>4</td><td>3</td><td>8</td><td>0</td><td>5</td><td>7</td><td>6</td><td>7</td></tr></table> <p><b>(b)</b> unsorted vector</p>	2	4	3	8	0	5	7	6	7
2	8	7																	
4	0	6																	
3	5	7																	
2	4	3	8	0	5	7	6	7											
	<table><tr><td>0</td><td>2</td><td>3</td><td>4</td><td>5</td><td>6</td><td>7</td><td>7</td><td>8</td></tr></table> <p>↑ median</p> <p><b>(c)</b> sorted vector, giving median</p>	0	2	3	4	5	6	7	7	8									
0	2	3	4	5	6	7	7	8											



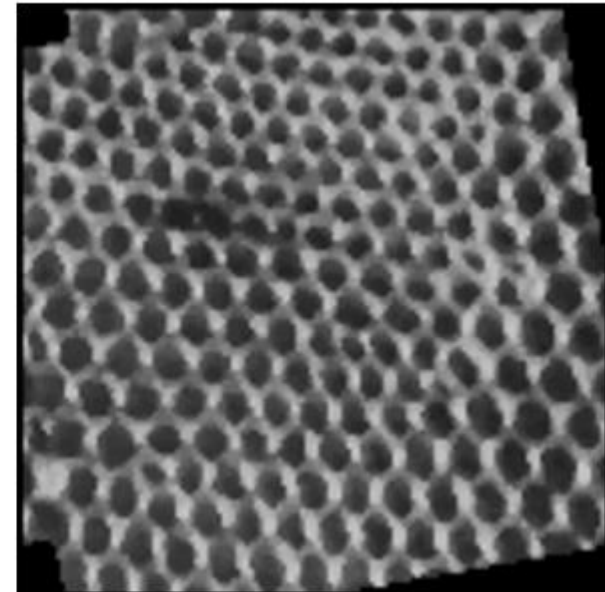
# Finding the median from a 3×3 template

Preserves edges

Removes salt and pepper noise



(a) rotated fence



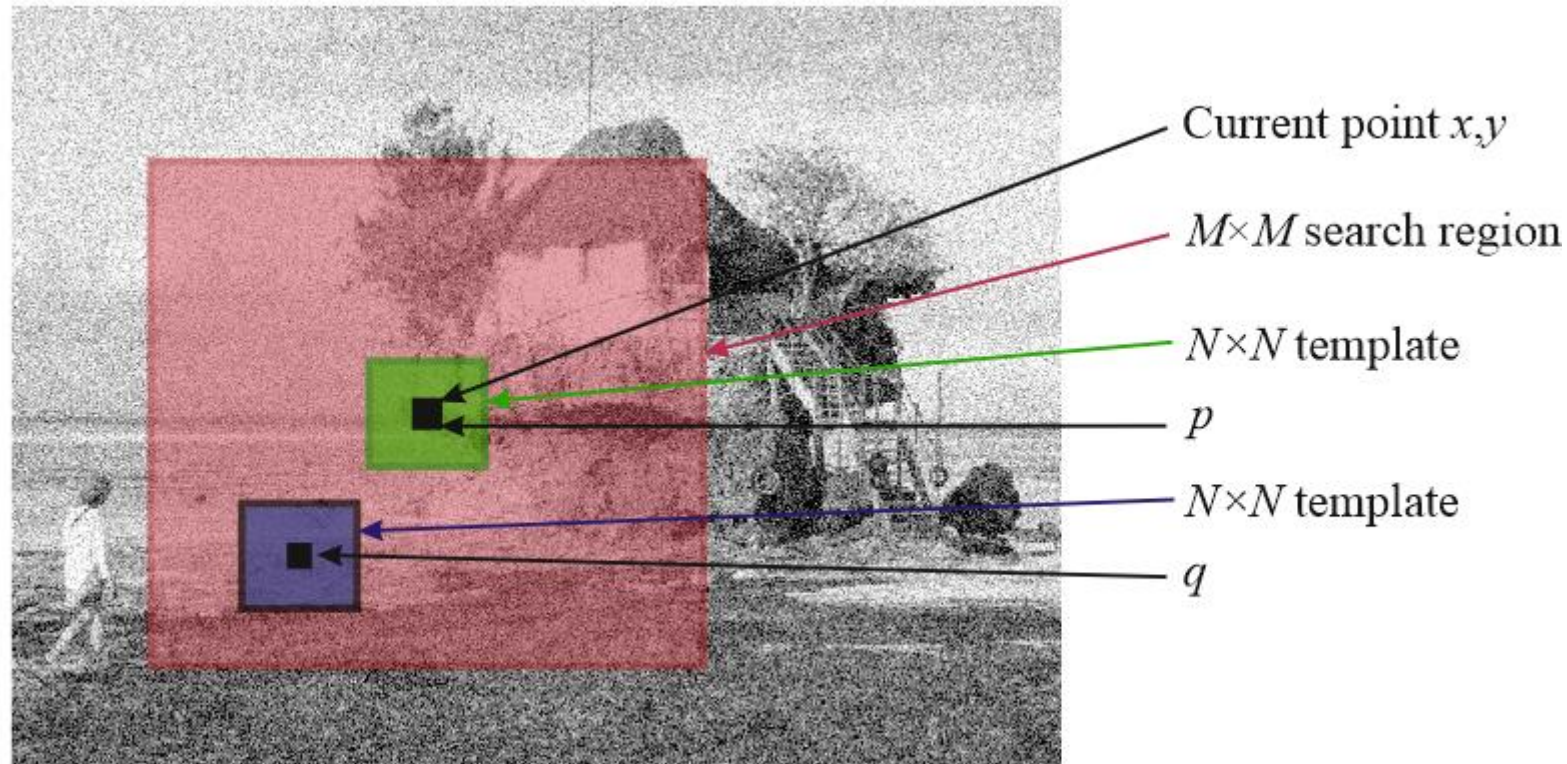
(b) median filtered





# Newer stuff: non local means

Averaging which preserves regions



# Applying non local means



(a) original image



(b) Gaussian averaging

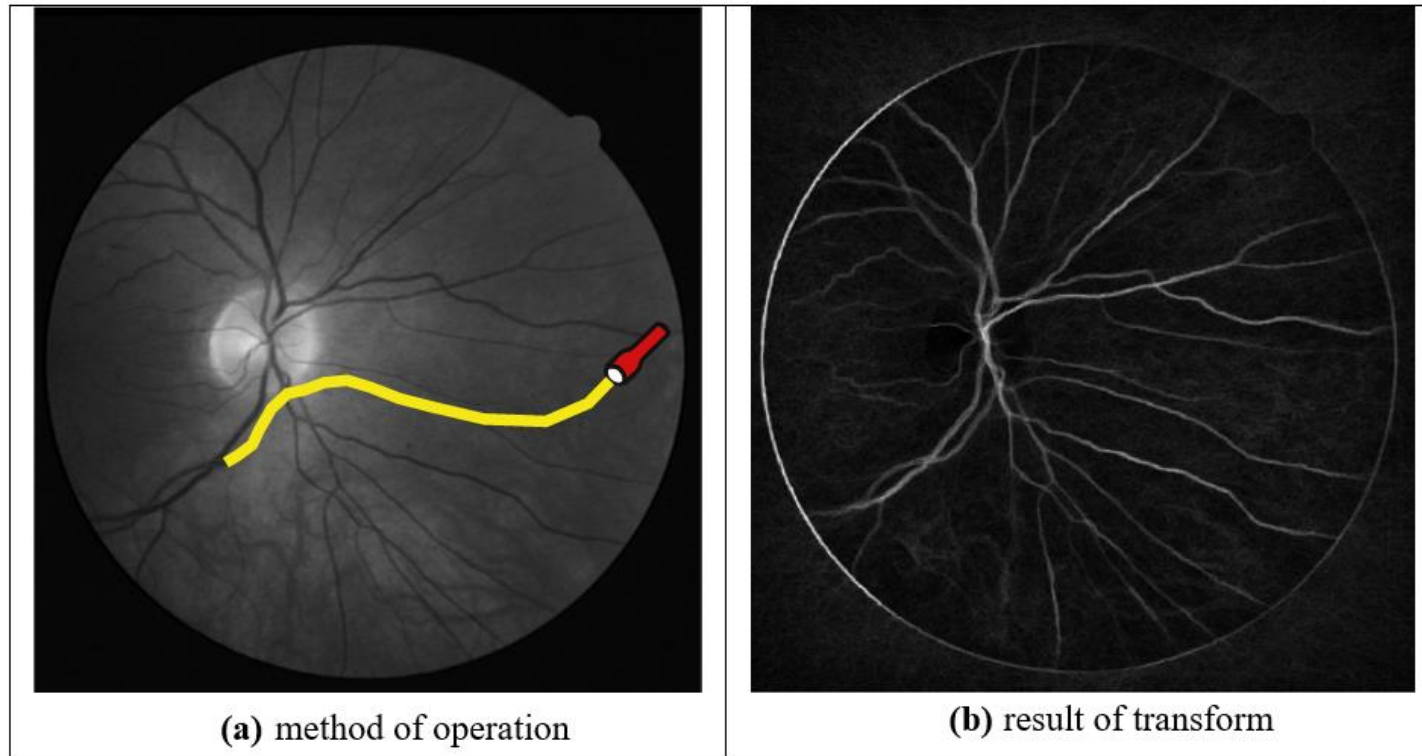


(c) nonlocal means

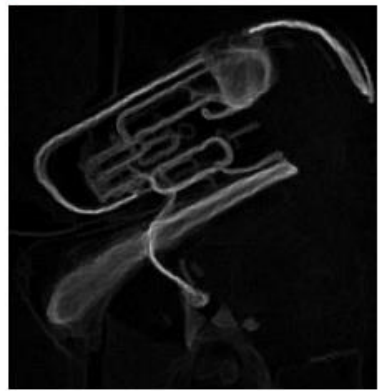


# Even newer stuff: Image Ray Transform

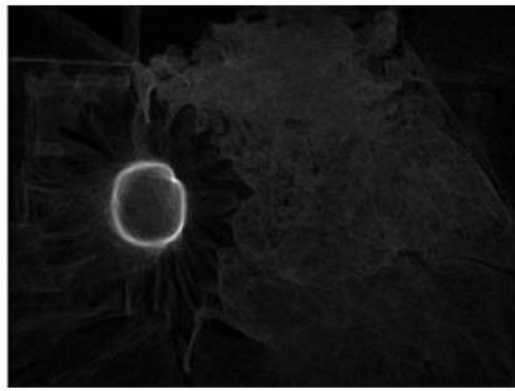
Use analogy to **light** to find shapes, removing remainder



# Applying Image Ray Transform



(a) tubular structure



(b) circular structure

Good results



(c) car

Poor result

# Comparing operators



(a) Original



(b) (a) with added Gaussian noise



(c) Averaged



(d) Gaussian smoothed



(e) Median



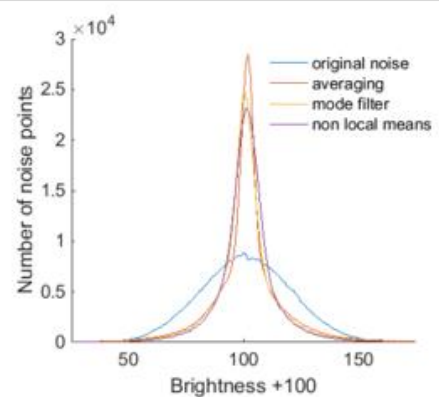
(f) Truncated Median



(g) Anisotropic diffusion



(h) Non-local-means



(i) Effect of filtering on noise

**Comparison of Filtering Operators**