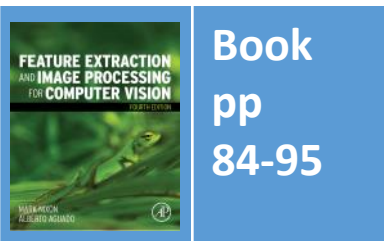


# Lecture 4 Point Operators

COMP3204 Computer Vision

**How many different operators are there which operate on image points?**



**Department of  
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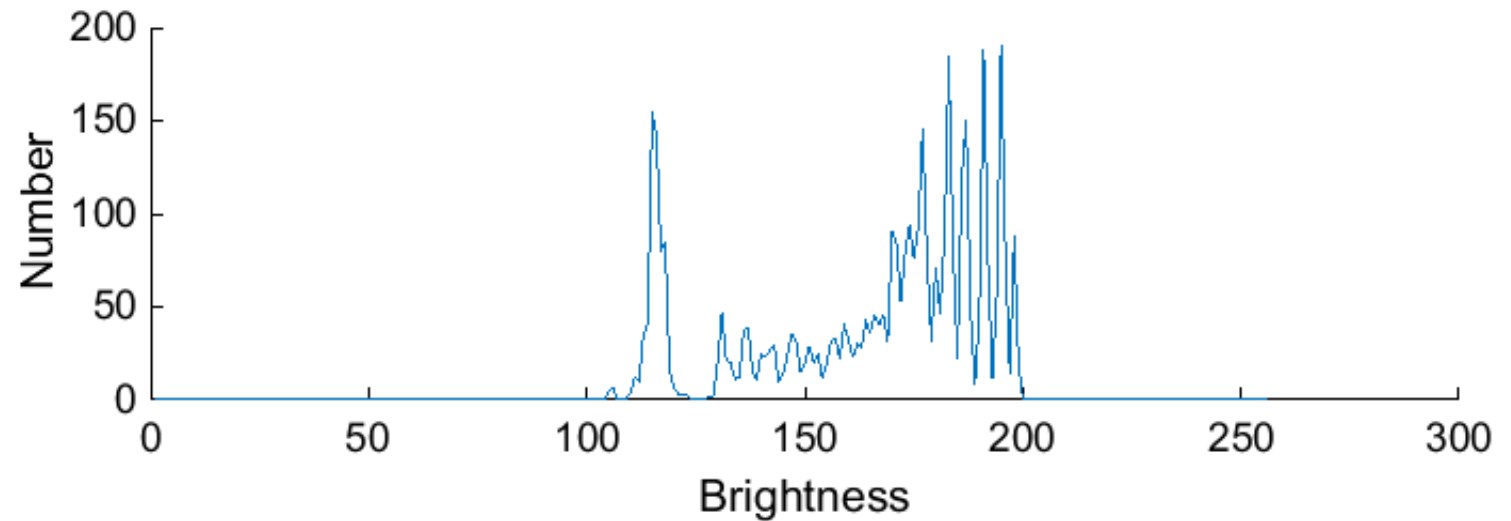
# Content

1. How do we best display images?
2. What operators are available which work solely on image points?

# An image and its histogram



**(a)** image of an eye



**(b)** histogram of eye image

The histogram shows **contrast**



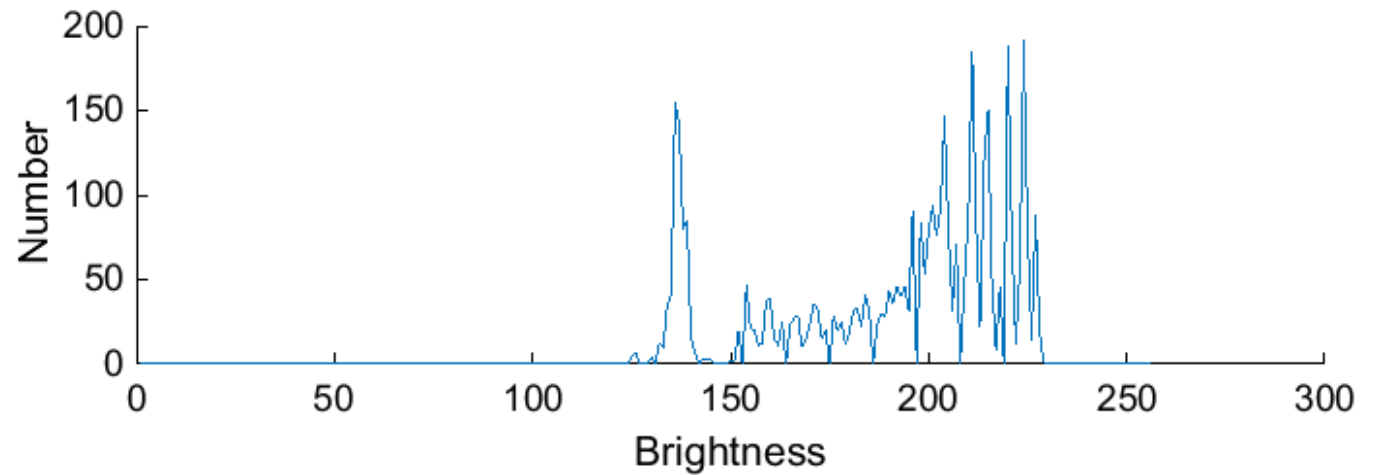
# Brightening an image

$$\mathbf{N}_{x,y} = k \times \mathbf{O}_{x,y} + l$$

new image **N**; old image **O**; gain  $k$ ; level  $l$ ; co-ordinates  $x,y$



(a) image of brighter eye

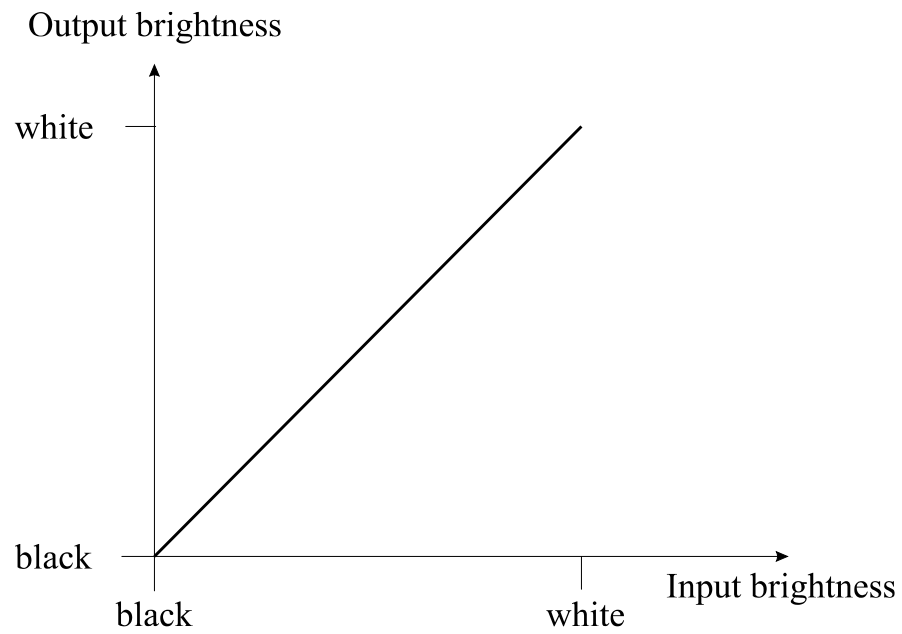


(b) histogram of brighter eye

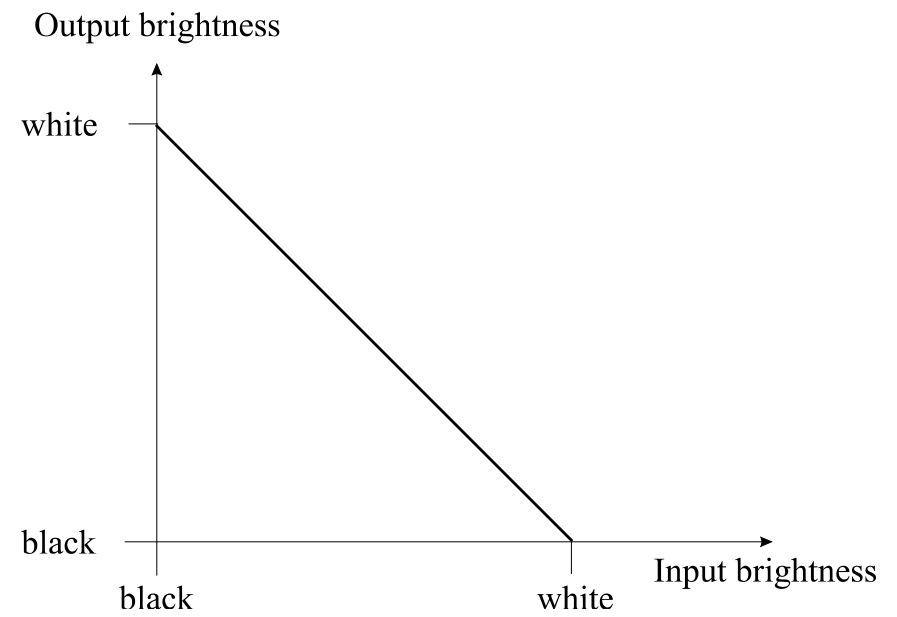
Then **choose** values for  $k$  and  $l$



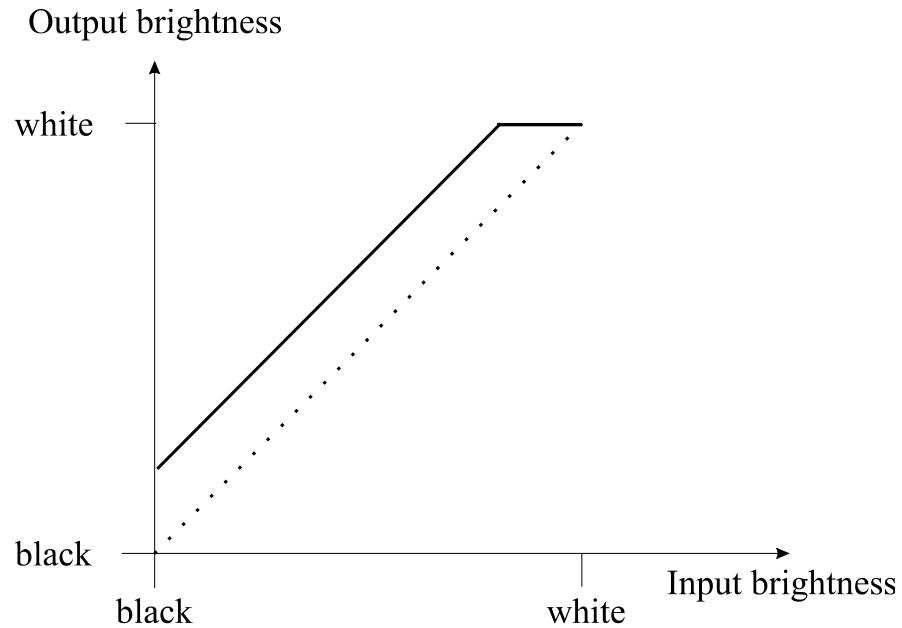
# Intensity mappings



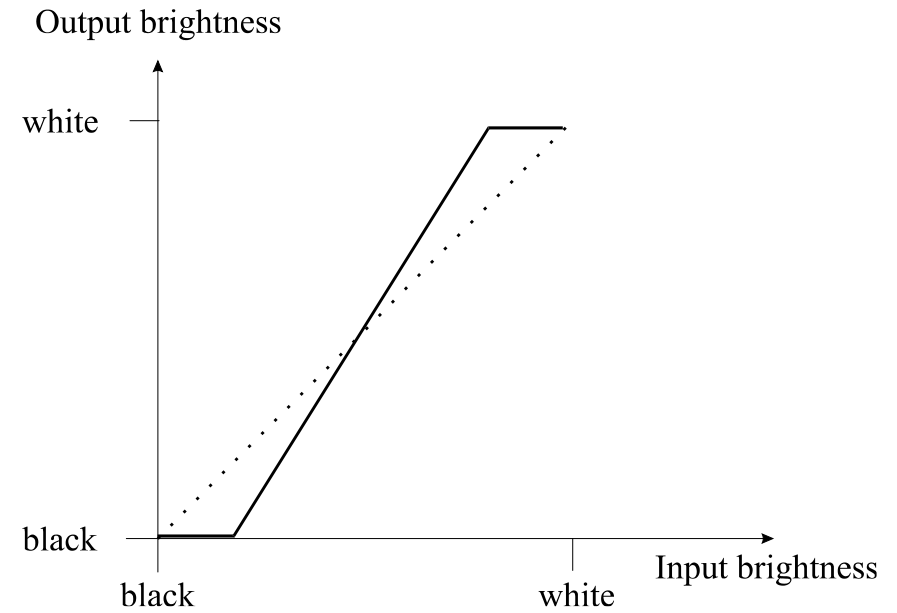
**(a) copy**



**(b) brightness inversion**



**(c) brightness addition**



**(d) brightness scaling by multiplication**



# Applying exponential and logarithmic point operators



**(a)** logarithmic compression

operators



**(b)** exponential expansion

$$\mathbf{N}_{x,y} = \log(\mathbf{O}_{x,y})$$

Brightness compression

$$\mathbf{N}_{x,y} = \exp(\mathbf{O}_{x,y})$$

Brightness expansion

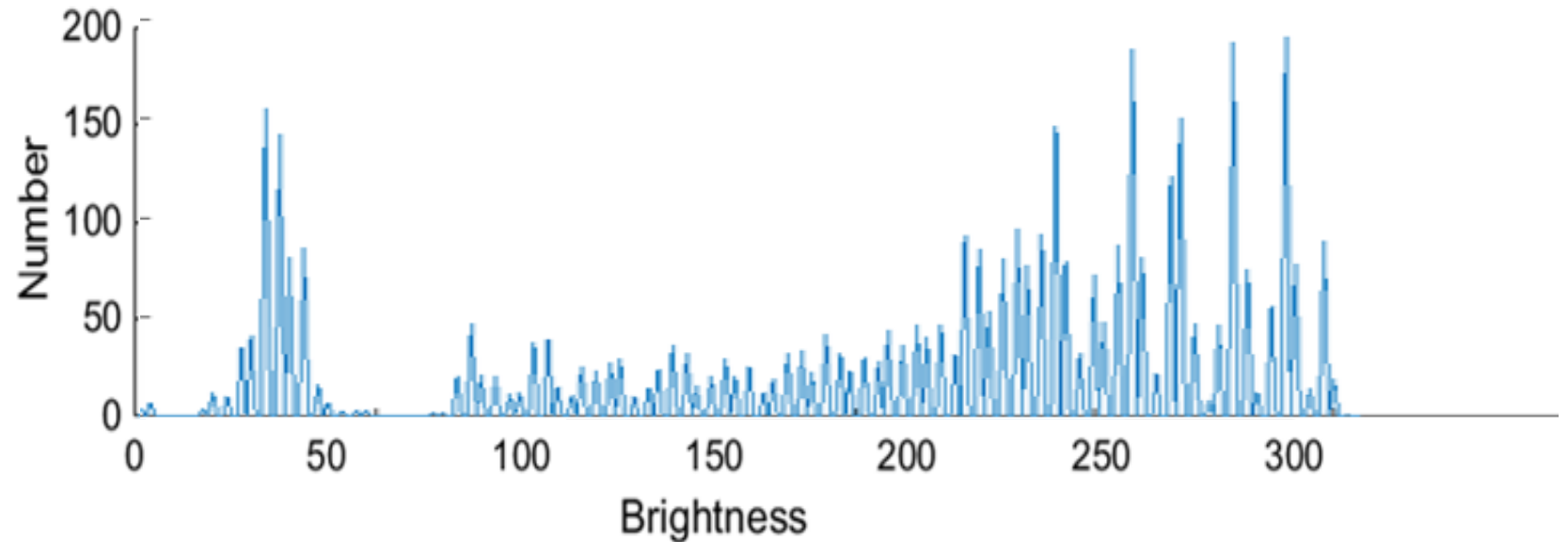
# Intensity normalisation - function

Aim is to use **all** available grey levels for display

**Original** histogram

**Shift origin** to zero

**Scale brightness** to  
use whole range



# Intensity normalisation

$$\mathbf{N}_{x,y} = \frac{\mathbf{Nmax} - \mathbf{Nmin}}{\mathbf{Omax} - \mathbf{Omin}} \times (\mathbf{O}_{x,y} - \mathbf{Omin}) + \mathbf{Nmin} \quad \forall x, y \in 1, N$$

new image **N**; old image **O**; co-ordinates  $x,y$

minimum input  **$N_{min}$**

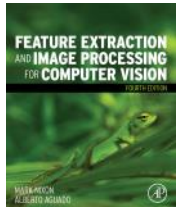
maximum input  **$N_{max}$**

minimum output  **$O_{min}$**

maximum output  $O_{max}$

$$\mathbf{N}_{x,y} = \frac{256}{\mathbf{Omax} - \mathbf{Omin}} \times (\mathbf{O}_{x,y} - \mathbf{Omin})$$

## Avoids need for parameter choice

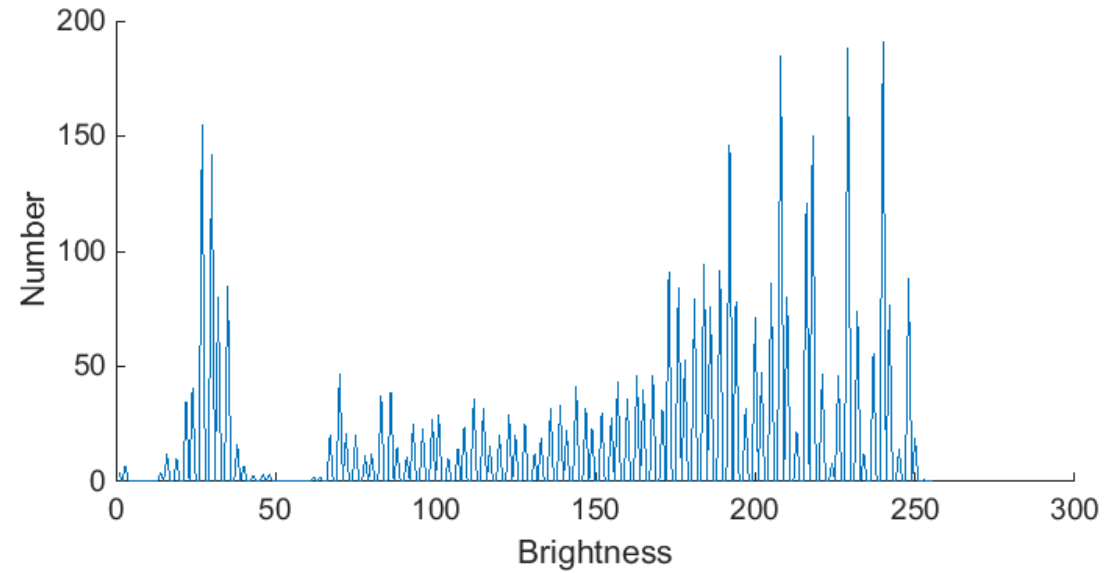




# Intensity normalisation and histogram equalisation



(a) intensity normalised eye



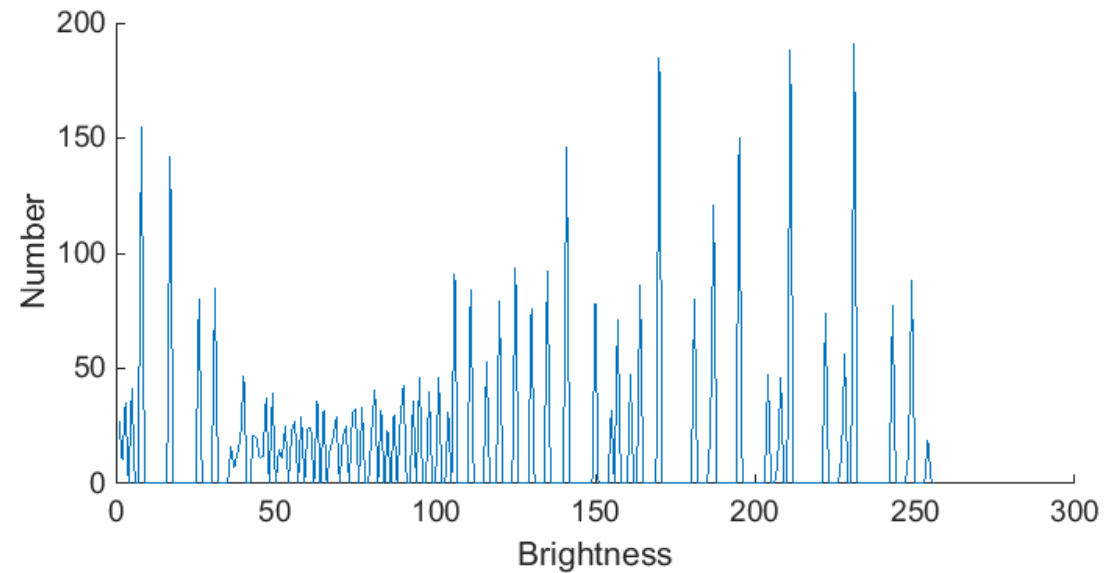
(b) histogram of intensity normalised eye

Grey levels all  
'weigh' the  
same

Used in  
Matlab's  
imagesc



(c) histogram equalised eye



(d) histogram of histogram equalised eye

Grey levels  
have different  
weights

Aimed for  
human vision



# Histogram Equalisation – aim is a flat histogram

$N^2$  points in the image; the **sum of points per level is equal** in equalised and original image

$$\sum_{l=0}^M \mathbf{O}(l) = \sum_{l=0}^M \mathbf{N}(l)$$

**cumulative histogram** up to level  $p$  should be **transformed** to cover up to the level  $q$

$$\sum_{l=0}^p \mathbf{O}(l) = \sum_{l=0}^q \mathbf{N}(l)$$

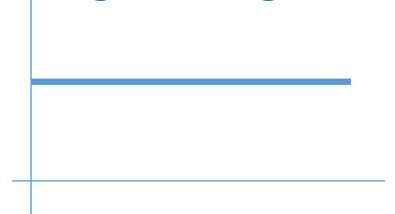
**number of points per level** in the output picture

$$\mathbf{N}(l) = \frac{N^2}{\mathbf{N}_{max} - \mathbf{N}_{min}}$$

**cumulative histogram** of the output picture

$$\sum_{l=0}^q \mathbf{N}(l) = q \times \frac{N^2}{\mathbf{N}_{max} - \mathbf{N}_{min}}$$

Target histogram



**mapping** for the output pixels at level  $q$

$$q = \frac{\mathbf{N}_{max} - \mathbf{N}_{min}}{N^2} \times \sum_{l=0}^p \mathbf{O}(l)$$

Often used in **medical image analysis**

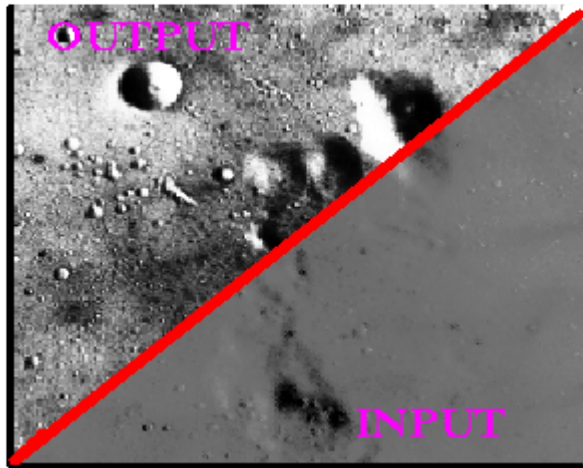
**Effective** ... but ... **nonlinear** and major problems with noise



# Fireside time

All this maths is a bit of a d'oh. Do we need it with deep learning?

# Applying intensity normalisation and histogram equalisation



<http://homepages.inf.ed.ac.uk/rbf/HIPR2/histeq.htm>;

[http://docs.opencv.org/doc/tutorials/imgproc/histograms/histogram\\_equalization/histogram\\_equalization.html](http://docs.opencv.org/doc/tutorials/imgproc/histograms/histogram_equalization/histogram_equalization.html) ;

<http://www.softpedia.com/get/Multimedia/Video/Other-VIDEO-Tools/Easy-Histogram-Equalization.shtml>

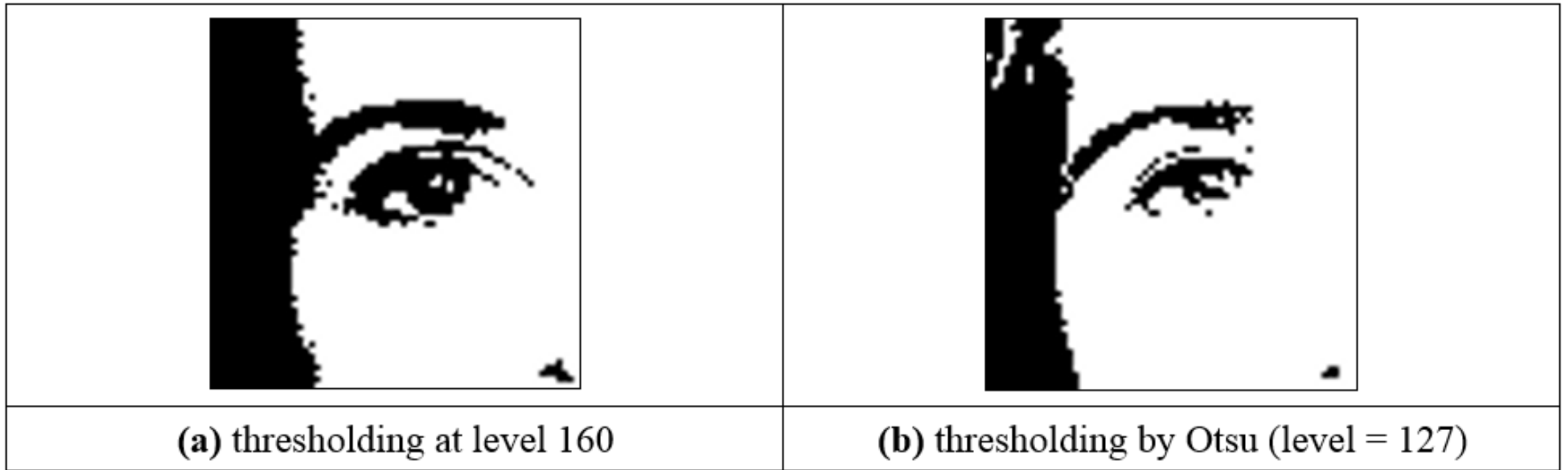
# Thresholding an eye image

Thresholding selects points that **exceed** a chosen threshold

$$N_{x,y} = \begin{cases} 255 & \text{if } N_{x,y} > \text{threshold} \\ 0 & \text{otherwise} \end{cases}$$



# Thresholding an eye image: manual vs automatic



Is optimal thresholding a **myth**??

# Thresholding an image of a walking subject



(a) walking subject



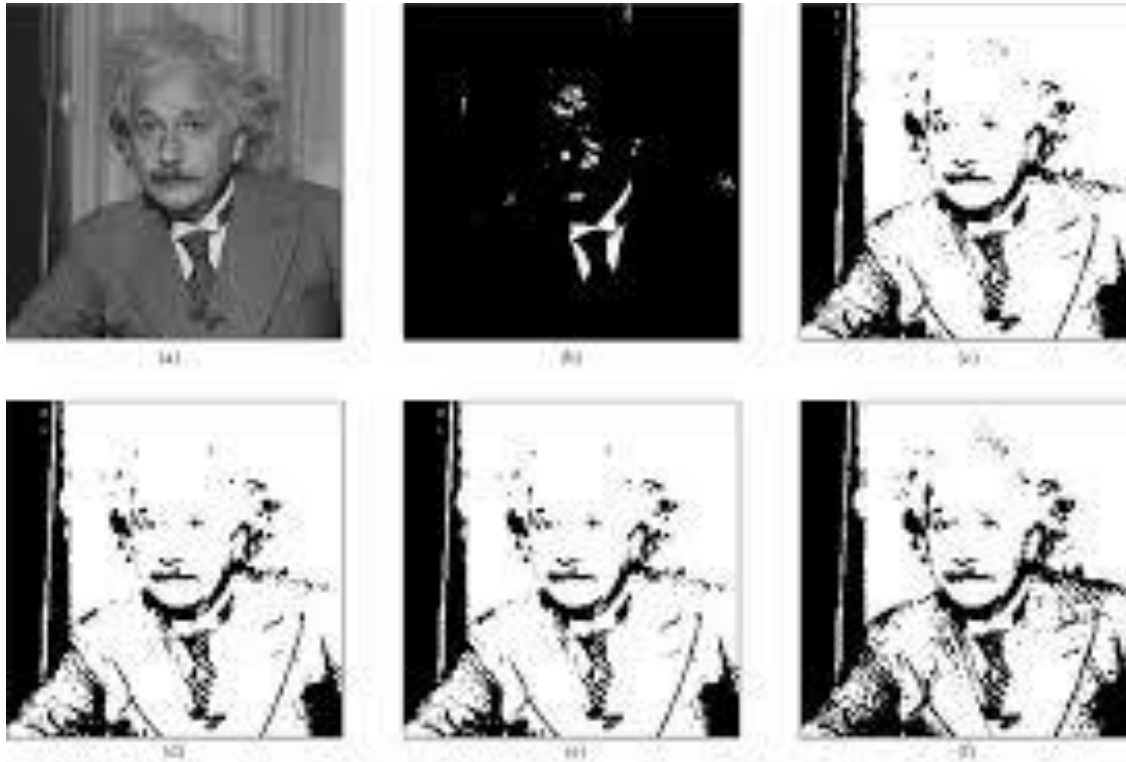
(b) automatic thresholding by Otsu

Many consider that **shape** concerns a **higher** level

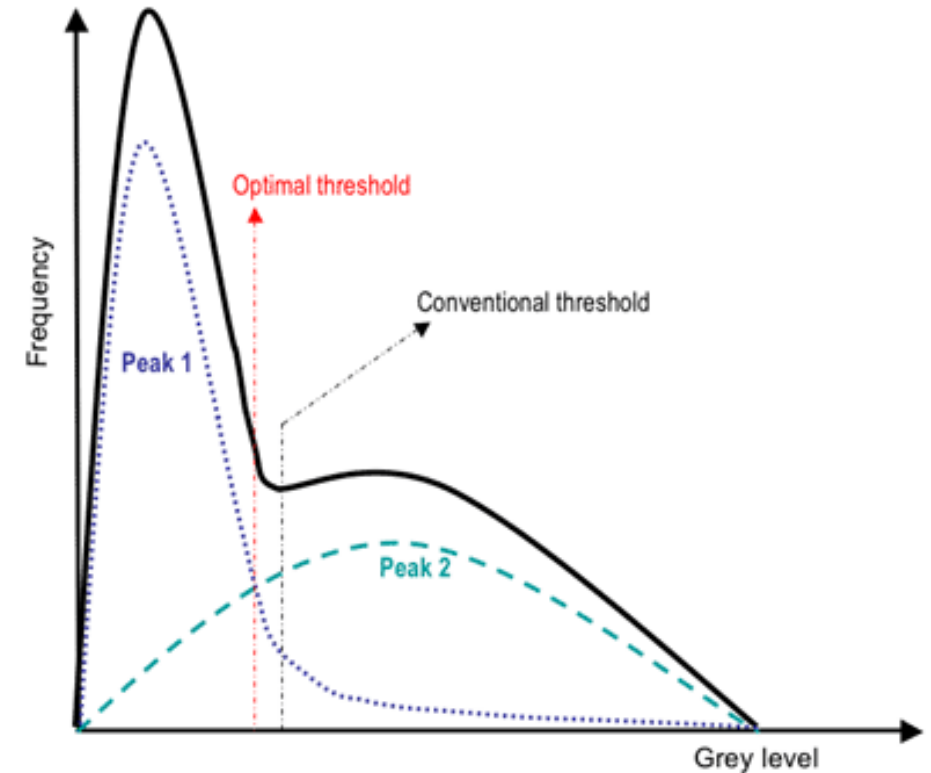


# Advanced thresholding

## Entropic thresholding (2010)



## Optimal thresholding



<http://opticalengineering.spiedigitallibrary.org/article.aspx?articleid=1096546;>

<https://www.cs.auckland.ac.nz/courses/compsci773s1c/lectures/ImageProcessing-html/topic3.htm>



# Takeaway time

1. **point operators** are largely about image display
2. concern **histogram** manipulation
3. **thresholding** used a lot
4. **intensity normalisation** used for display

Need sets of points. That's group operators, coming next.

