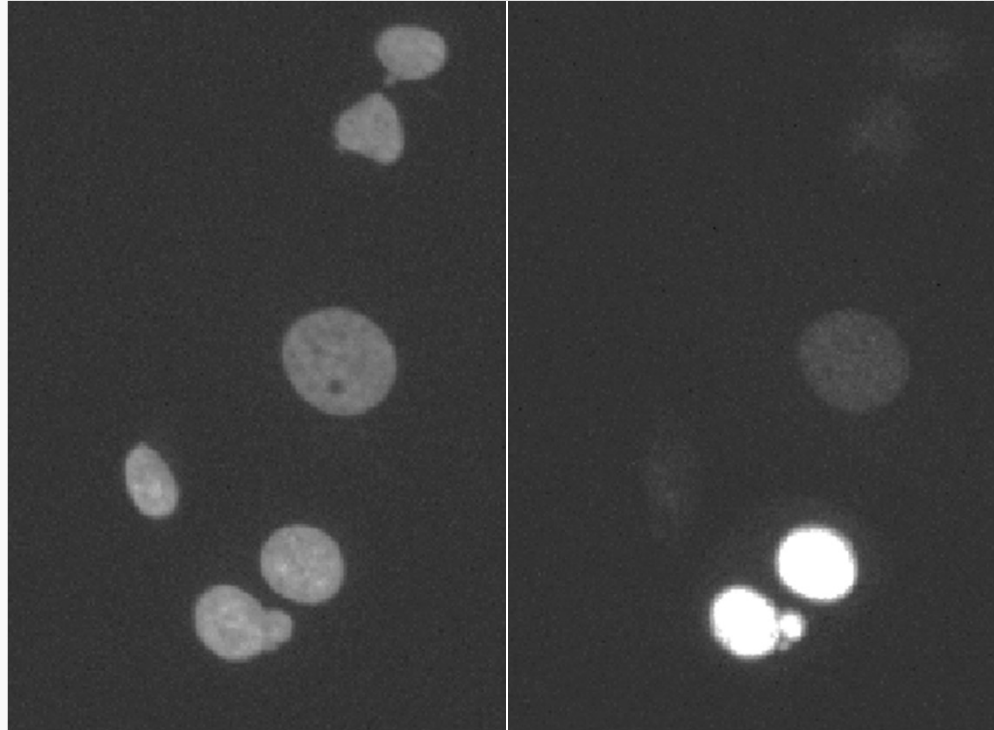


# MATLAB lecture 7: Image intensity measurements and corrections

MCDB/BCHM 4312/5312

# Homework: Hoechst or pRB?

Hoechst  
Nuclear marker



pRB  
Cell division marker

- Rule of thumb: don't segment on the same channel you're trying to measure
- Why? Because if the signal changes, you might end up missing some cells

# Learning goals

- Image data types revisited
- Common sources of intensity noise and how to address
  - Uneven contrast
  - Salt-and-pepper
- Adjusting image brightness and contrast


# Image data types

- All information in a computer is stored as bits

1

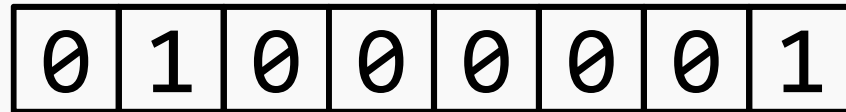
0

- The data type of a variable describes how the bits are interpreted by the computer

Name ▲	Value
	316x190 <b>uint16</b>

- Two main data types: integers and floating-point numbers (doubles)

# Integers



What is the value of the unsigned integer above?

- (A) 20
- (B) 131
- (C) 65
- (D) 1000001

# Integers

0	1	0	0	0	0	0	1
$2^7$	$2^6$	$2^5$	$2^4$	$2^3$	$2^2$	$2^1$	$2^0$

$$= 0 \times 2^7 + 1 \times 2^6 + 0 \times 2^5 + \dots$$

$$+ 0 \times 2^1 + 1 \times 2^0$$

$$= 64 + 1$$

$$= 65$$

# Properties of integers

Which of the following is true?

- (A) Integers can only represent whole numbers (no decimals)
- (B) Unsigned integers, can only represent positive numbers and zero
- (C) Largest unsigned number is  $(2^N - 1)$  where  $N =$  number of bits
- (D) All the above

# Properties of integers

Which of the following is true?

- (A) Integers can only represent whole numbers (no decimals)
- (B) Unsigned integers, can only represent positive numbers and zero
- (C) Largest unsigned number is  $(2^N - 1)$  where  $N =$  number of bits
- (D) All the above



# Integers

0	1	0	0	0	0	0	1
$2^7$	$2^6$	$2^5$	$2^4$	$2^3$	$2^2$	$2^1$	$2^0$

$$= 0 \times 2^7 + 1 \times 2^6 + 0 \times 2^5 + \dots$$

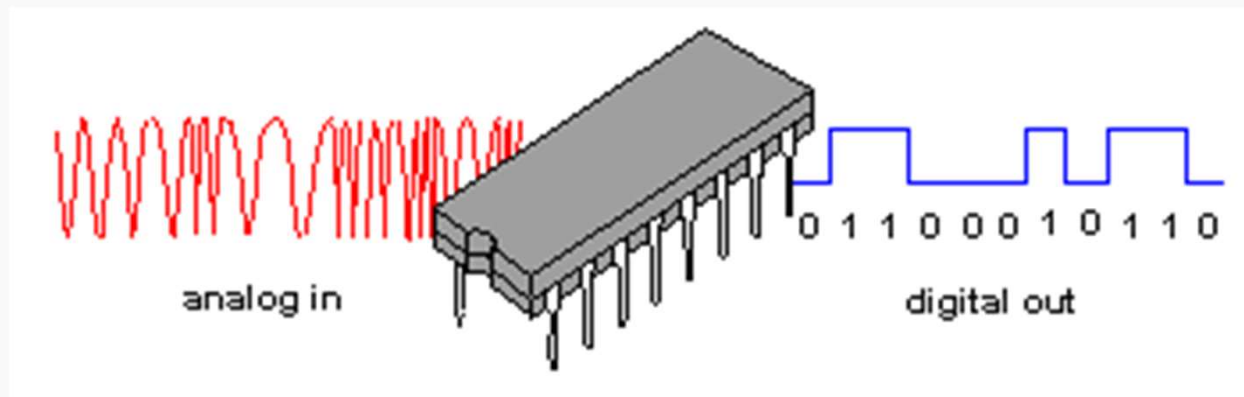
$$+ 0 \times 2^1 + 1 \times 2^0$$

$$= 64 + 1$$

$$= 65$$

# Images are usually saved as integers

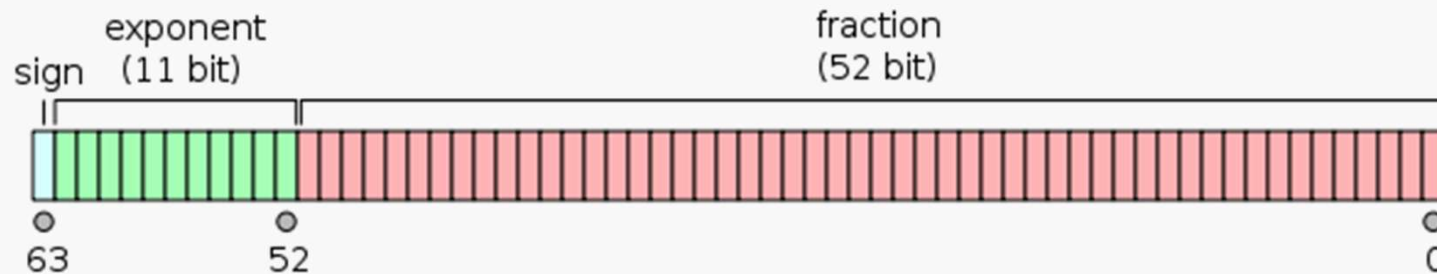
- Cameras have a component called an Analog-to-Digital converter (A/D converter or ADC)
- Converts the signal from the detector (e.g. PMT, CCD arrays) which is analog voltage into a digital number



- Current gen microscopes typically record images as uint16

# Floating point numbers

- Floating point numbers can have both signs and decimal places
- Decimal numbers are represented by defining some number of bits to represent the exponent



$$3.1421 = \underset{\text{Sign}}{+} \underset{\text{Fraction}}{31421} \times 10^{\underset{\text{Exponent}}{-5}}$$

- In MATLAB, the default number type is a **double**, which is a floating point number
  - A double is short for double-precision or 64-bits

## Why is this important?

- Be careful when doing operations with integer numbers
- For example:

```
>> uint8(5)/2  
ans = 3
```

```
>> uint8(5) * 100  
ans = 255
```

```
>> uint8(5) - 10  
ans = 0
```

# Converting between integer and double

- Avoid potential issues by converting integer images into double format **before carrying out mathematical operations**

```
>> I = imread('cameraman.tif');  
>> I_double = double(I);
```

- Some functions will behave differently depending on whether the image data is a double or an unsigned integer

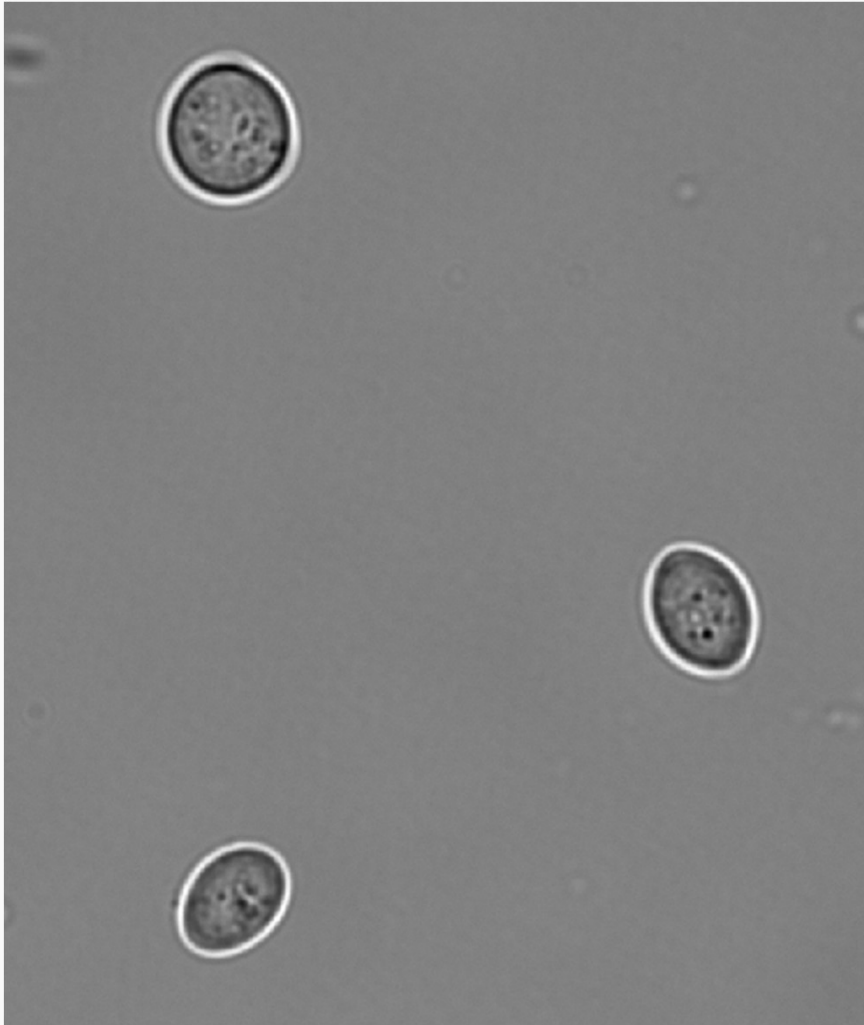
**CHECK THE DOCUMENTATION FOR DETAILS**

# Low intensity image corrections

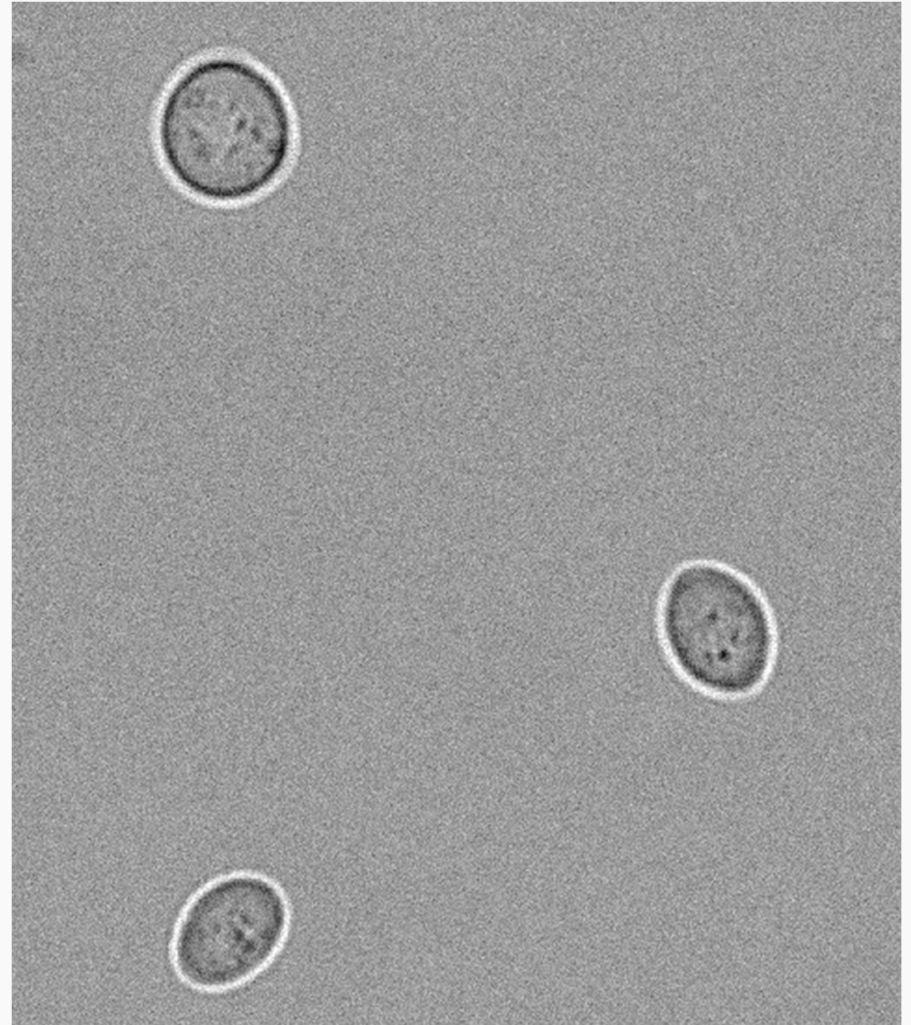
- As you saw in the last homework, segmentation is much easier when there is a bright marker that is in every cell
- However, sometimes things do not go as planned and images are dim:
  - Poor dye permeability
  - Poor antibody labelling
  - Low expression of fluorescent protein
  - Or mistakes during imaging – this is pretty common

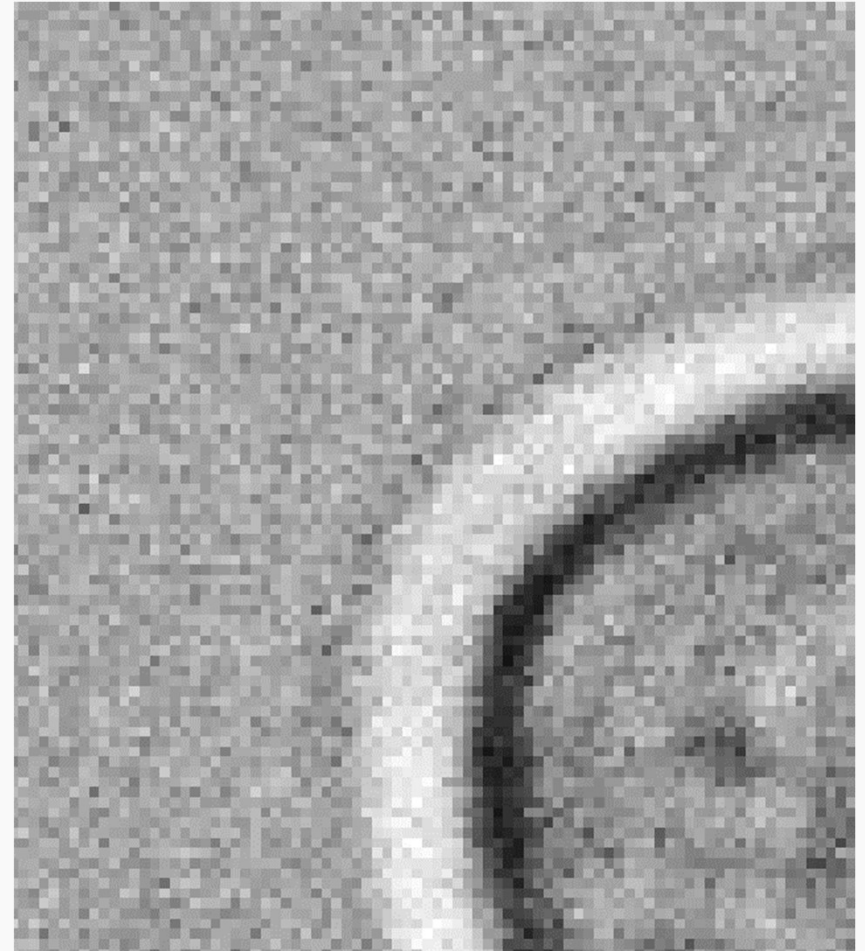
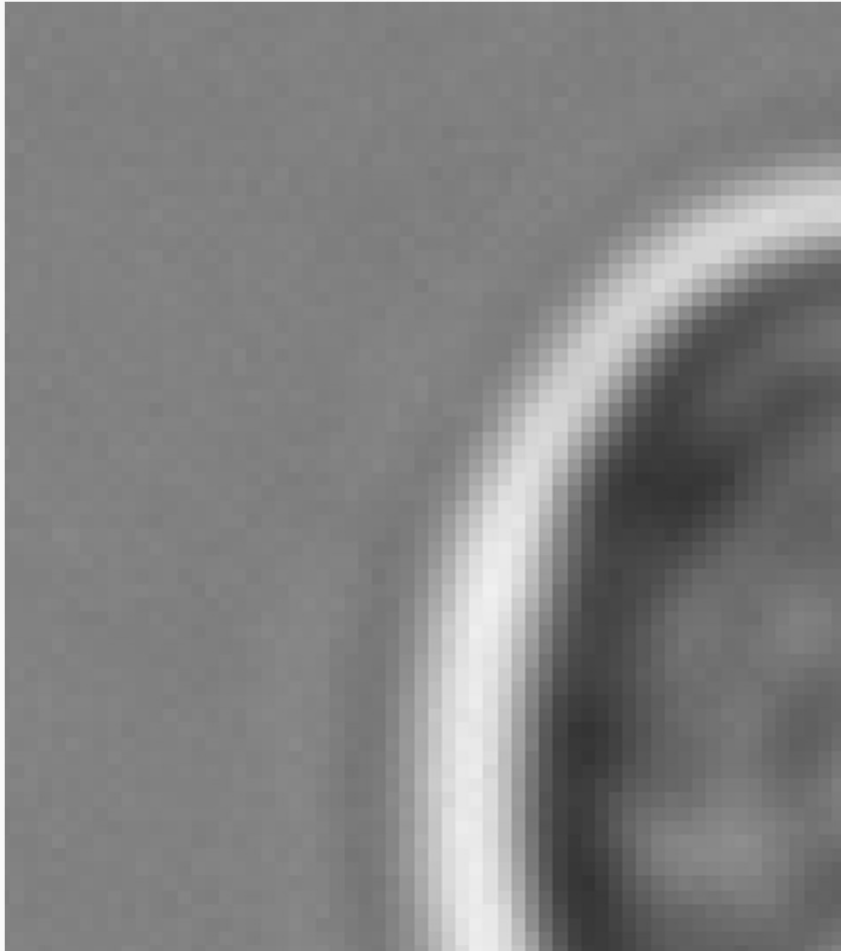
Which of these images has the lower intensity?

A



B







# Noise in images

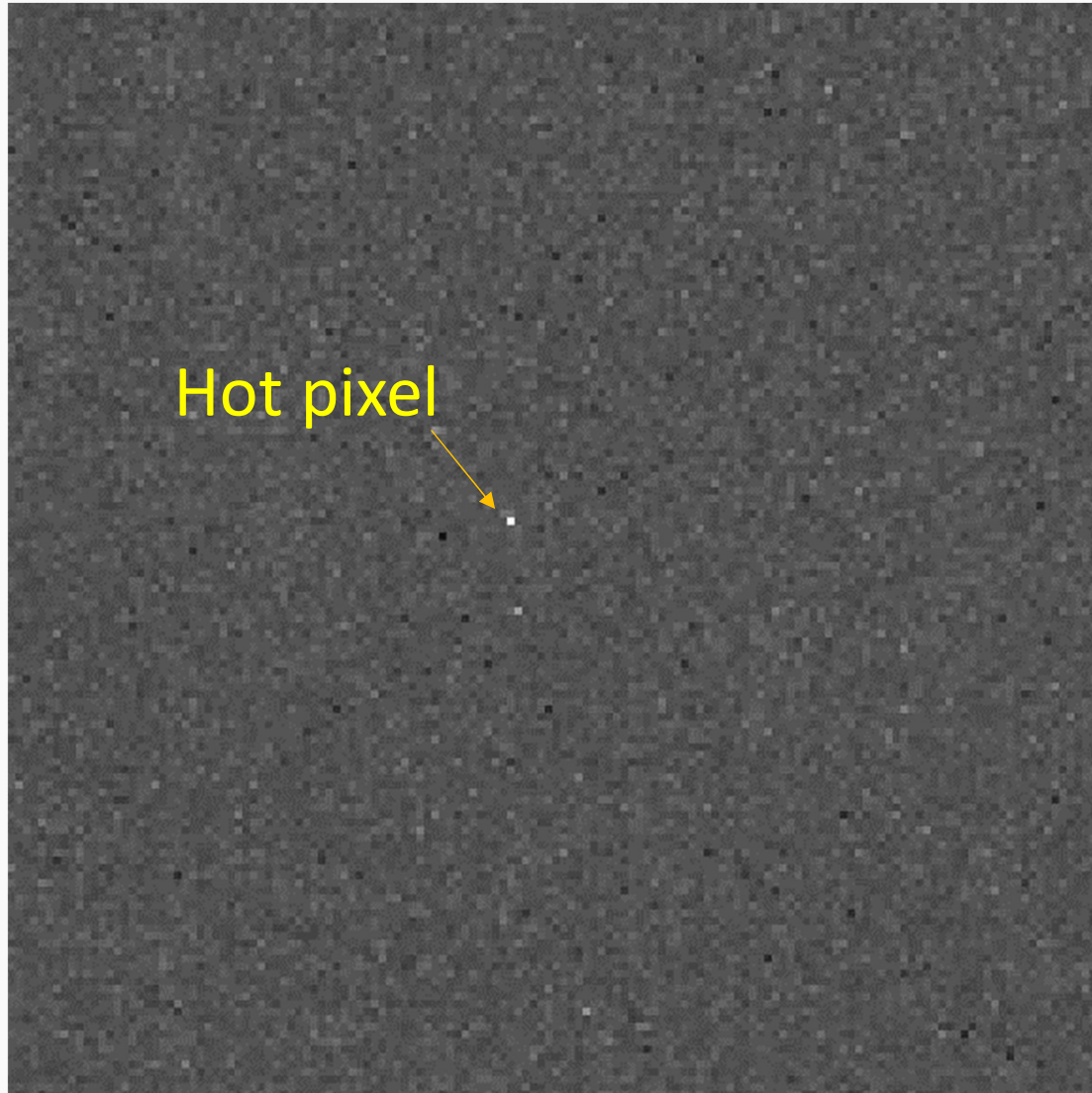
- Dim images typically have a speckle pattern
- The pattern is mostly formed by inherent noise from the detector or the light source
  - Shot noise
  - Read noise
  - Digitization noise
- Hot pixels – pixels which are always bright
- Noise is typically a single pixel in "size"

Random noise

Intensity changes randomly over time

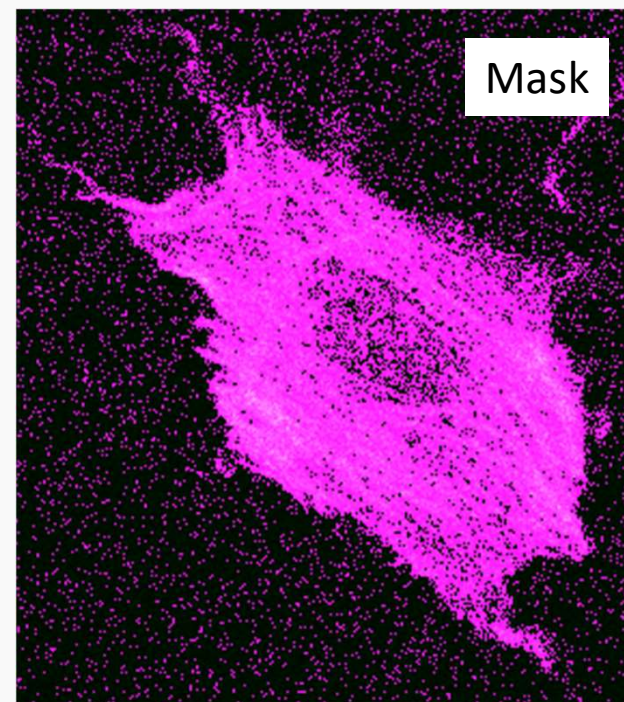
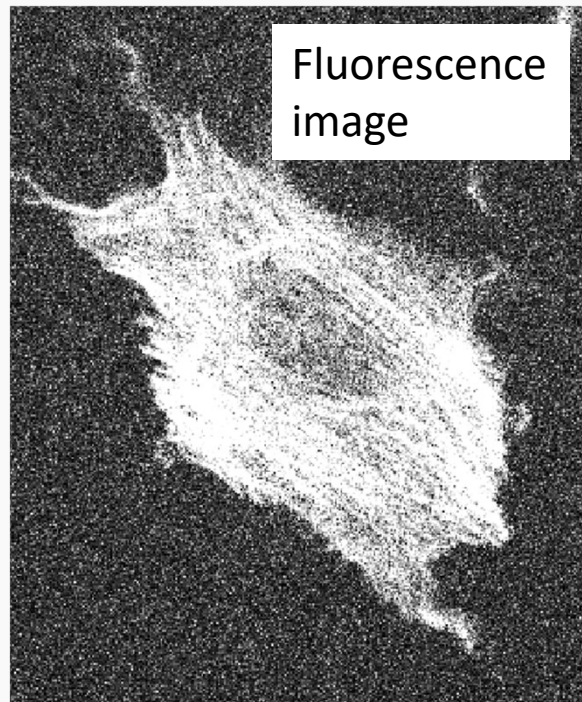
Joe will cover these in detail next week

# Example of noise



# Why get rid of noise?

- Noise will show up in segmentation

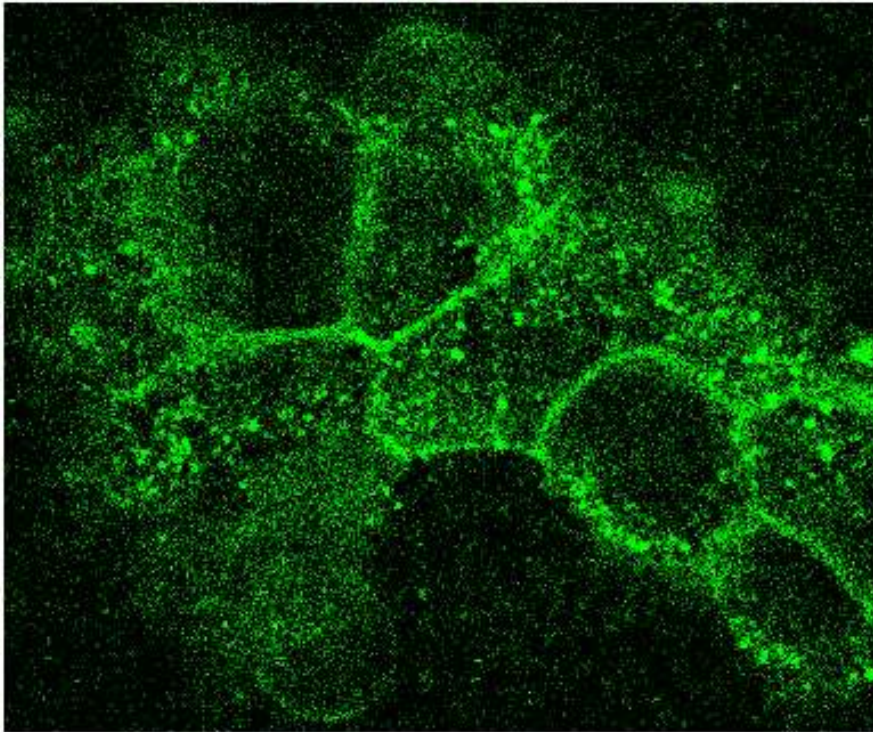


- Obscures smaller details – i.e. sub-cellular structures

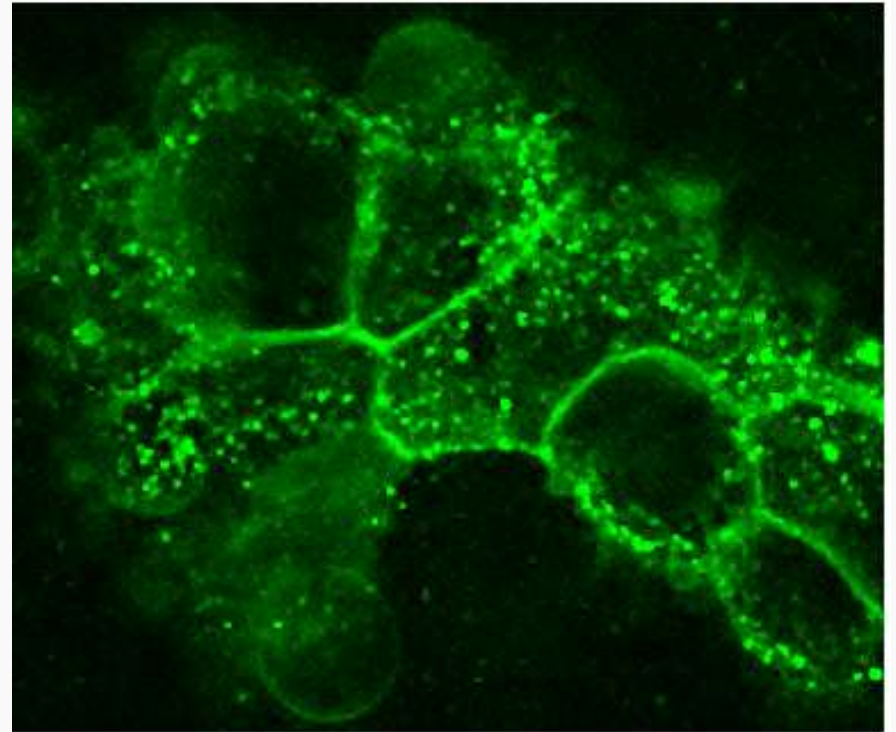


Noisy image

Trying to identify puncta (spots)



"Denoised" image



You can only clean up an image if the structures are  $> 2$  pixels  
Why? Random noise is typically 1 pixel in size

# Image filters

- Image filters are digital operations which are applied to the image data
- Two main filters:
  - Gaussian filter
  - Median filter
- These are not physical filters (e.g. fluorescence filters). They are mathematical functions which transform the image.

## Gaussian filter

Which of the following equations describes a Gaussian?

(A)  $y = mx + c$

(B)  $f(r) = A \exp(-r^2/w^2)$

(C)  $x^2 + y^2 = r^2$

(D)  $y = Ax^3 + Bx^2 + Cx$

## Gaussian filter

Which of the following equations describes a Gaussian?

(A)  $y = mx + c$

(B)  $f(r) = A \exp(-r^2/w^2)$

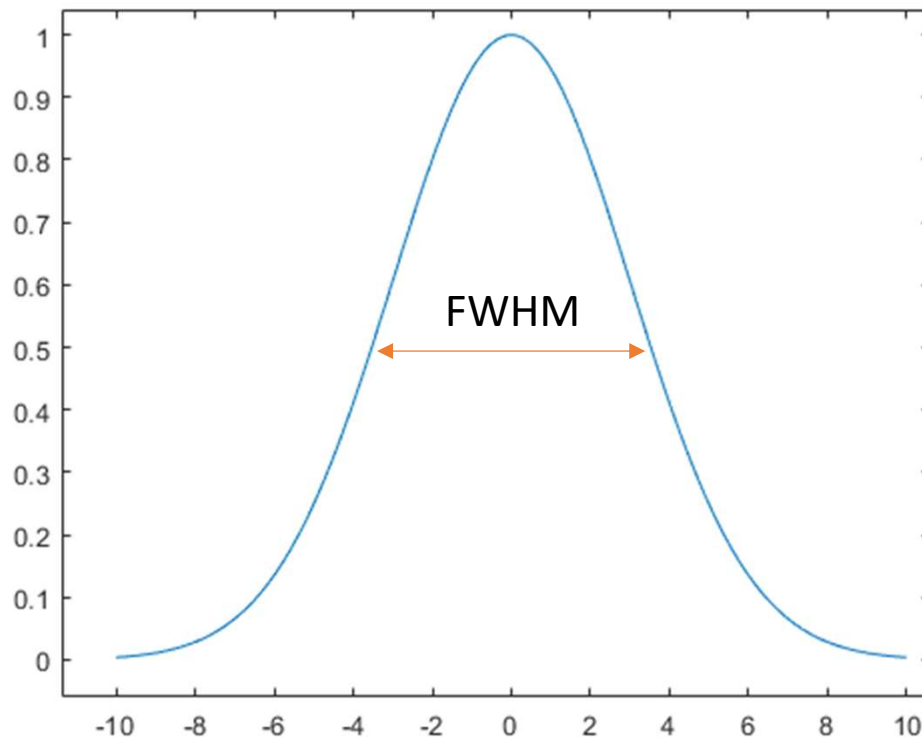
(C)  $x^2 + y^2 = r^2$

(D)  $y = Ax^3 + Bx^2 + Cx$

# Gaussian equation

1-D Gaussian equation

$$y = A \exp\left(-\frac{(x - x_0)^2}{2\sigma^2}\right)$$



A = amplitude

$x_0$  = x-offset

$\sigma$  = width

The width of a Gaussian is commonly defined at 0.5A

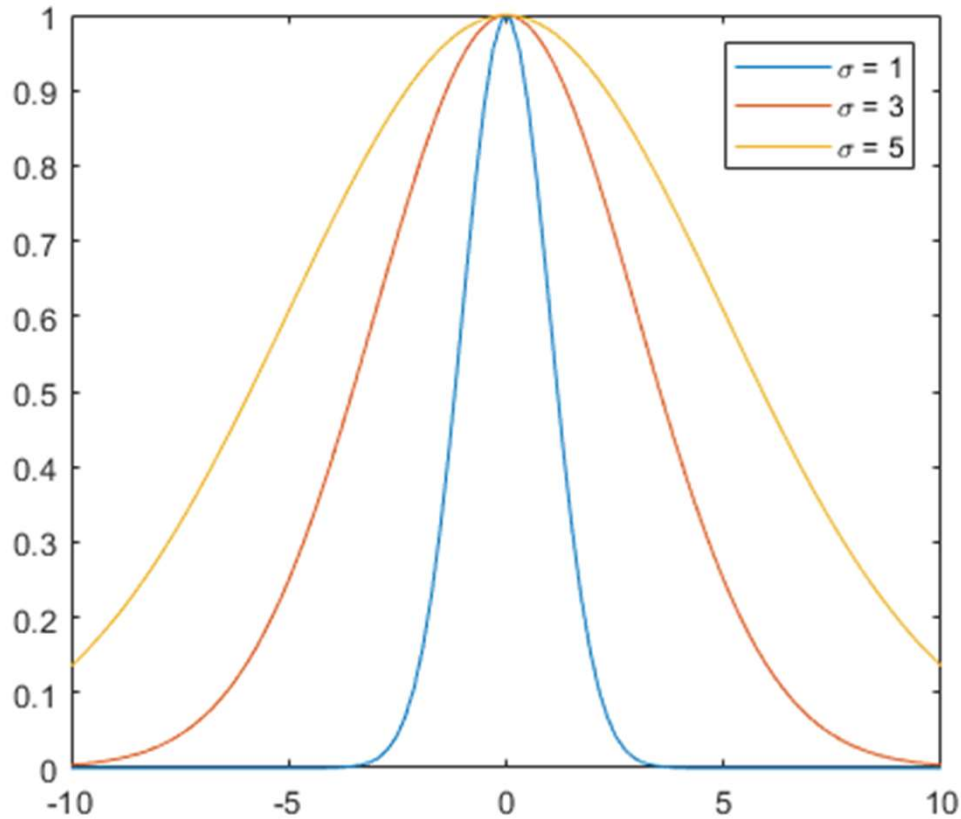
= Full width at half max (FWHM)



# Gaussian equation

1-D Gaussian equation

$$y = A \exp\left(-\frac{(x - x_0)^2}{2\sigma^2}\right)$$



A = amplitude

$x_0$  = x-offset

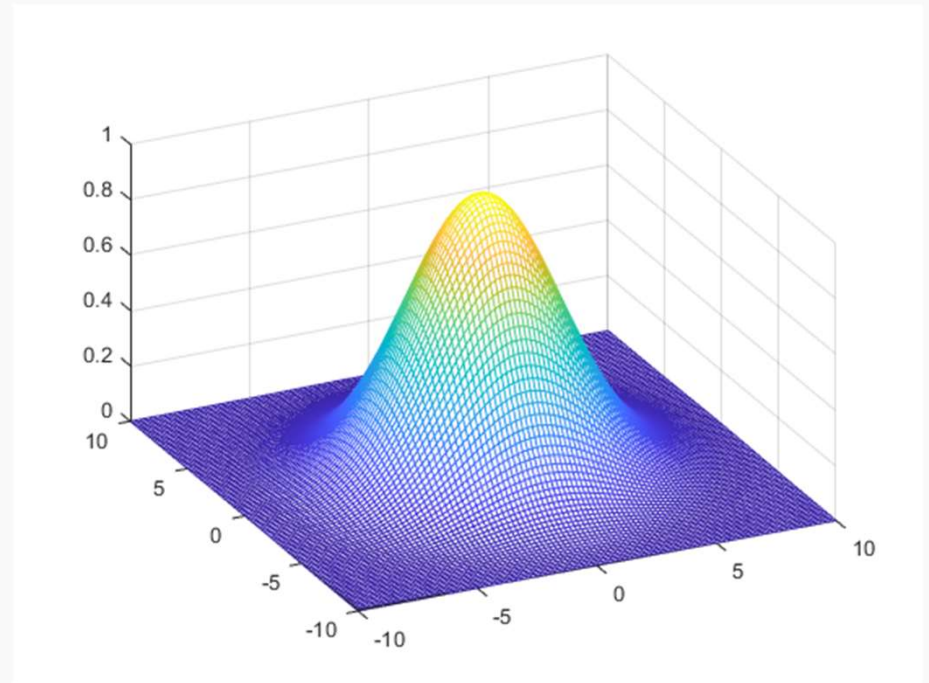
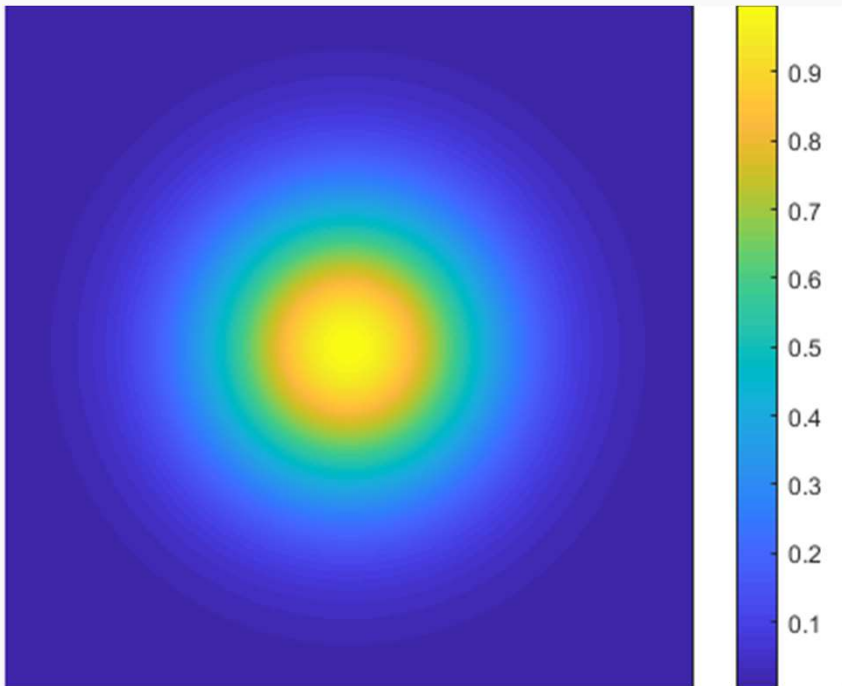
$\sigma$  = width

Increasing  $\sigma$  gives wider distributions

# Gaussian equation

2-D Gaussian equation

$$f(x, y) = A \exp \left( -\frac{(x - x_0)^2 + (y - y_0)^2}{2\sigma^2} \right)$$



# Gaussian filter

Original image

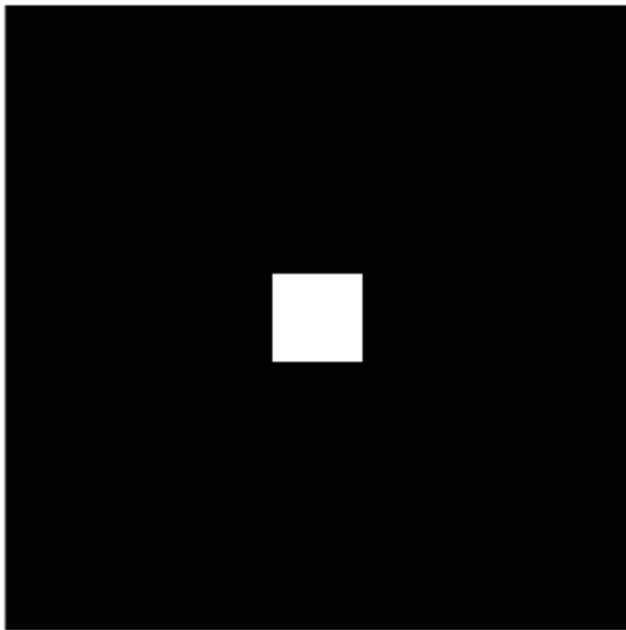
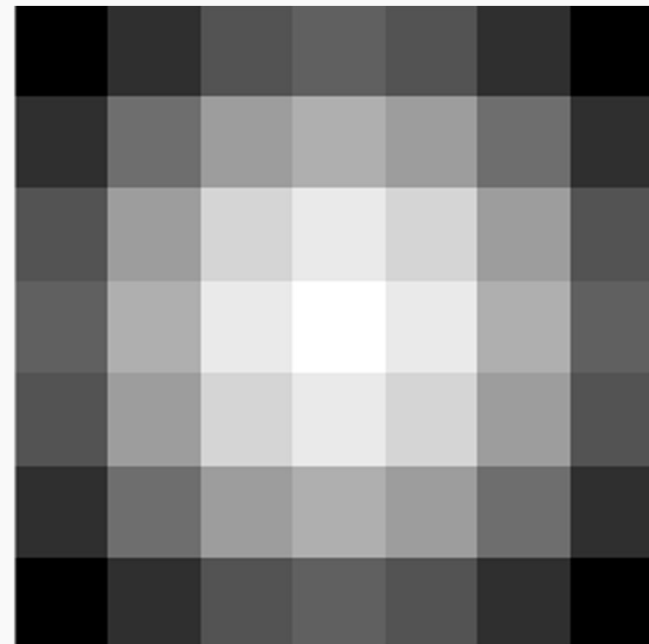


Image after Gaussian filter  
 $\sigma = 3$



The Gaussian filter spreads out pixel intensities in the image following a Gaussian distribution

# Gaussian filter

Syntax:

```
Ifilt = imgaussfilt(I, sigma)
```

sigma = width of filter

```
I = imread('cameraman.tif');
```

```
%Add noise to the image
```

```
I = imnoise(I, 'Poisson');
```

```
Ifilt = imgaussfilt(I, 2);
```

```
imshowpair(I, Ifilt, 'montage')
```

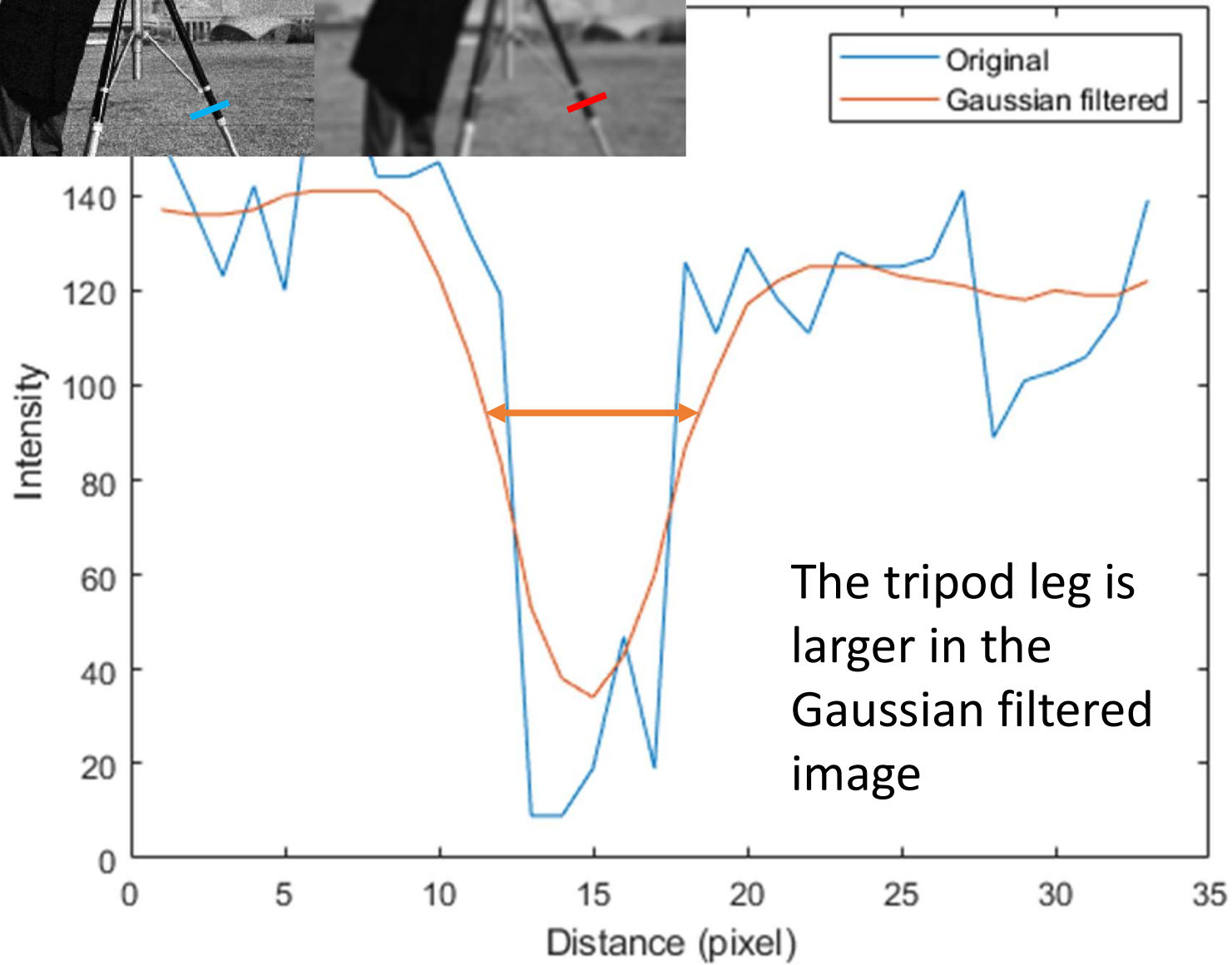
Noisy image



Gaussian filtered image



For obvious reasons, this function is also called a "Gaussian blur"



## Full example code

```
I = imread('cameraman.tif');
I = imnoise(I, 'Poisson');
Igauss = imgaussfilt(I, 2);

imshow([I, Igauss])
imshow(I)

%Measure line profile across a camera leg
[CX, CY, C1] = improfile; %Chosen by hand
C2 = improfile(Igauss, CX, CY); %Measure the same spot

figure;
plot(C1)
hold on
plot(C2)
```

# Median filter

```
Iout = medfilt2(I, [M, N])
```

- For each input pixel, the output is computed as the median of the numbers in the specified neighborhood of  $M \times N$  pixels
- $M \times N$  also called the "window"
- $M \times N$  should be odd numbers



# Example of a 3x3 median filter

Input image

10	5	10	2
5	2	3	1
8	1	5	1

10	5	10	2
5	2	3	1
8	1	5	1

10	5	10	2
5	2	3	1
8	1	5	1

Output image


	5		

	5	2	

# Example of a 3x3 median filter

Zero padding by default

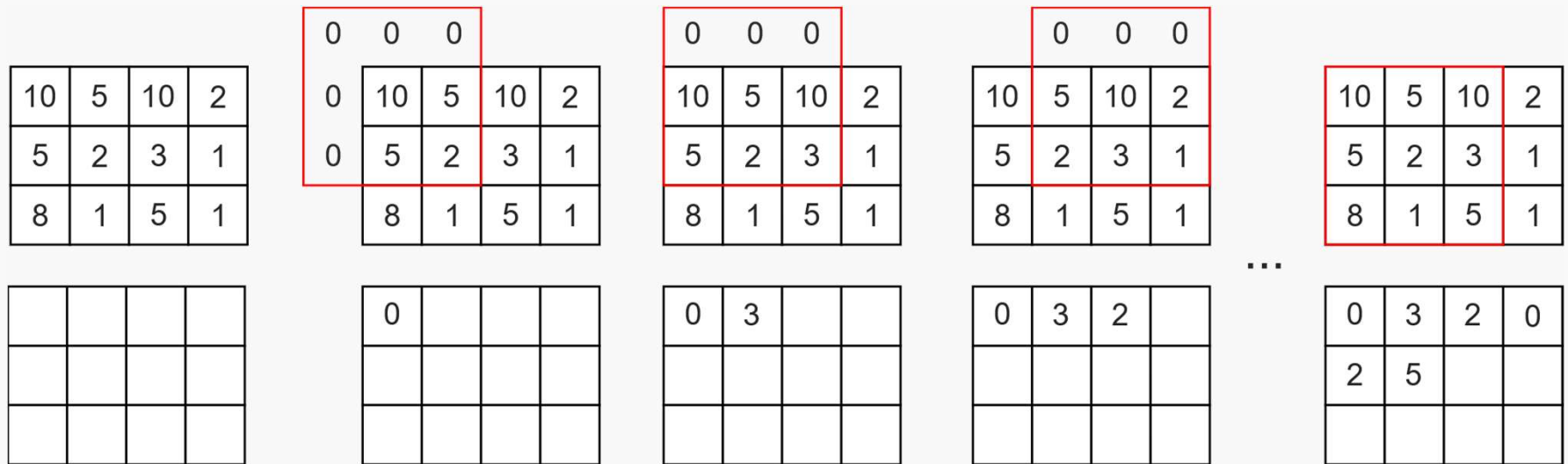
0	0	0		
0	10	5	10	2
0	5	2	3	1
	8	1	5	1

0			
	5	2	

0	0	0	
10	5	10	2
5	2	3	1
8	1	5	1

0	3		
	5	2	

# The median filter is applied pixel-by-pixel



Output =

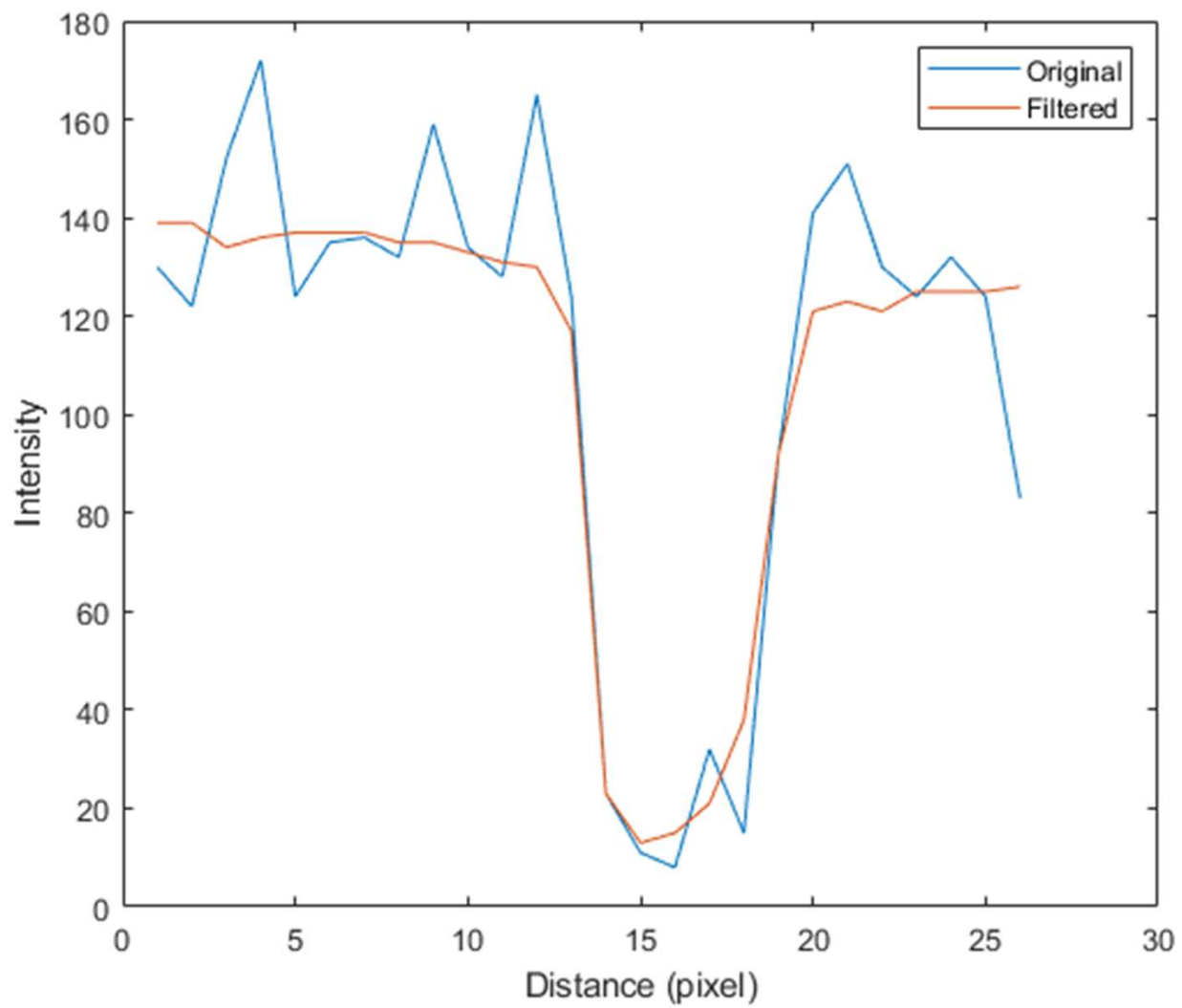
0	3	2	0
2	5	2	1
0	2	1	0

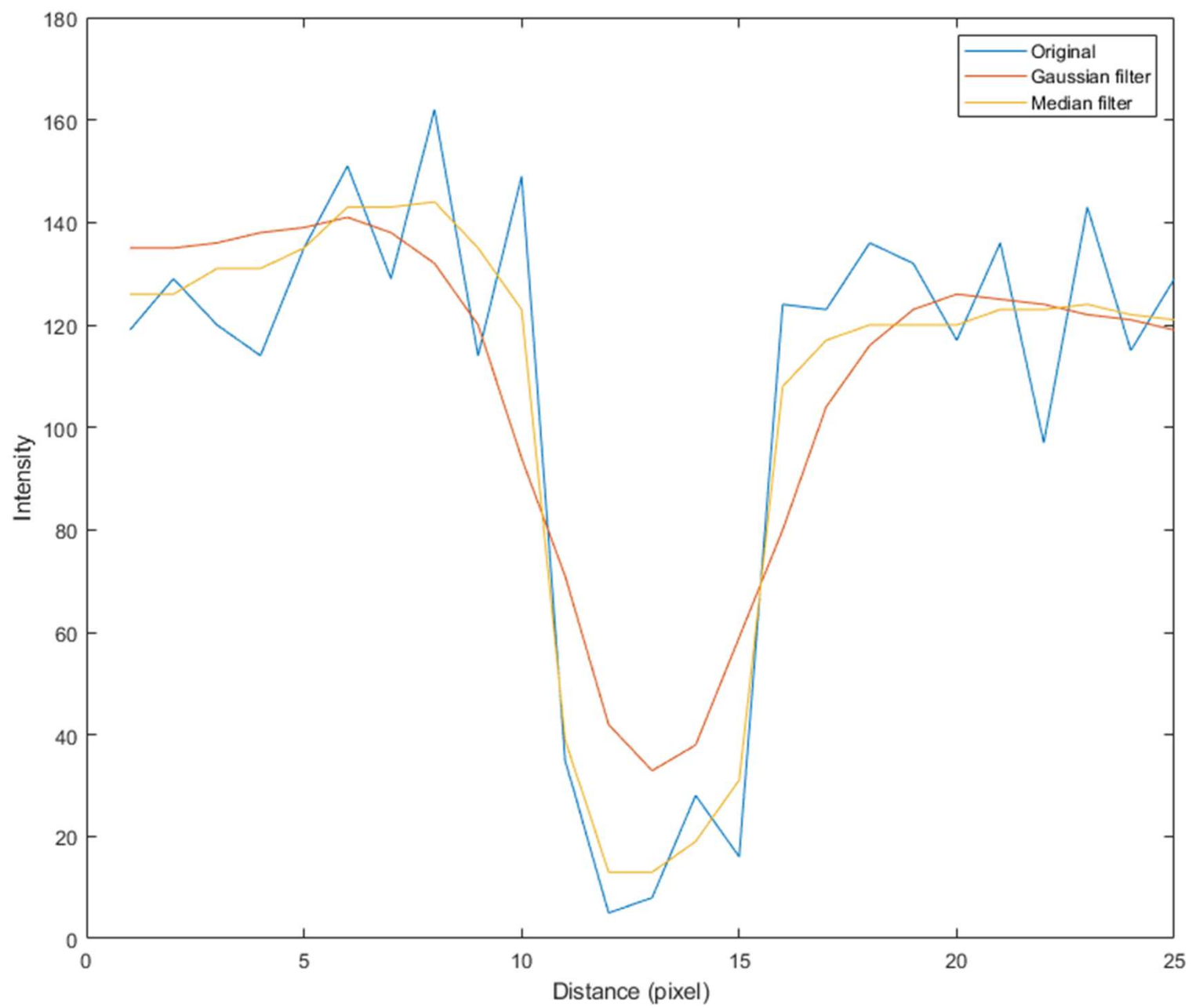
## Example

Change your script to use the median filter with a window of 5x5 instead of the Gaussian

```
Ifilt = medfilt2(I, [M, N])
```







# Example

```
I = imread('cameraman.tif');
I = imnoise(I, 'Poisson');
Igauss = imgaussfilt(I, 2);

%Measure line profile across a camera leg
imshow(I)
[CX, CY, C1] = improfile; %Chosen by hand
C2 = improfile(Igauss, CX, CY); %Measure the same spot

Imedfilt = medfilt2(I, [5, 5]);

%Measure line profile across a camera leg
C3 = improfile(Imedfilt, CX, CY); %Measure the same spot

figure;
plot(C1)
hold on
plot(C2)
plot(C3)
hold off
legend('Original', 'Gaussian filter', 'Median filter')
xlabel('Distance (pixel)')
ylabel('Intensity')
```

# Edge padding options

0	0	0		
0	10	5	10	2
0	5	2	3	1
	8	1	5	1

Default zero padding

```
medfilt2(I, [3 3])
```

2	5	2		
5	10	5	10	2
2	5	2	3	1
	8	1	5	1

'Symmetric'

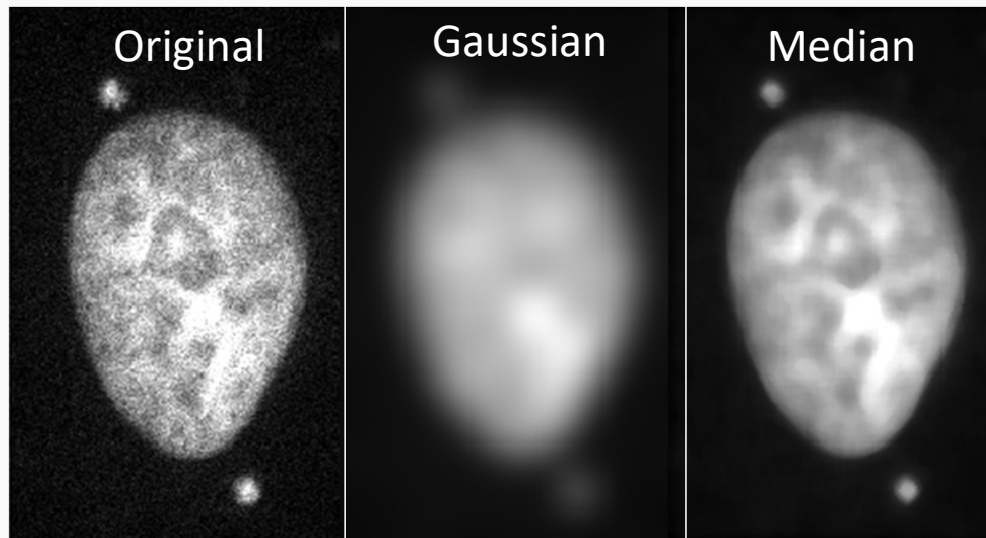
Reflects matrix

```
medfilt2(I, [3 3], 'symmetric')
```



## When would you pick Gaussian over median filters?

- Gaussian filters can be useful when you are trying to segment a large object, but its intensity is uneven



- Gaussian filters are also used when detecting particles – more on this in a later lecture!

# Choosing size of the filters

- The size of the filters chosen depends on the size of the feature you are trying to detect
- Size = sigma for Gaussian filter, the window [M, N] for the median filter
- In general, the filters should be larger than the noise you are trying to remove, but usually smaller than the object or feature you are trying to detect