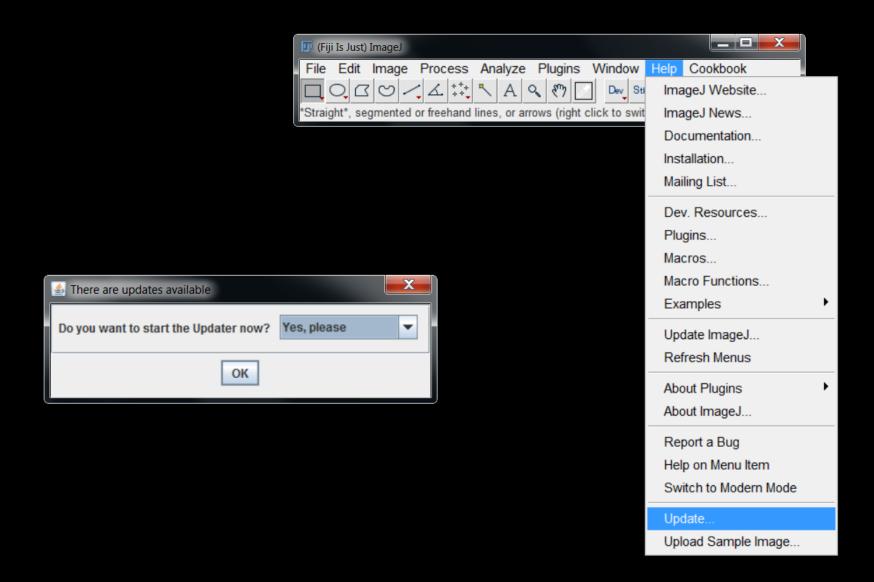
Introduction to Image Analysis with



PLEASE ENSURE FIJI IS INSTALLED CORRECTLY!



WHAT DO WE HOPE TO ACHIEVE?



Specifically, the workshop will cover the following topics:

- 1. Opening images with Bioformats
- 2. Interpreting histograms
- 3. Basic segmentation
- 4. Filtering images
- 5. Intro to morphological quantification
- 6. Analysis of protein expression

[•] Basic morphological quantification of cells and spatial analysis of protein expression.

AIMS

- Introduction to image analysis concepts
- Gentle introduction to FIJI

FORMAT

- General overview
- Small chunks of theory/demonstration, each followed by a practical.
- Challenges
- Break for tea/coffee at 15:30
- Finish about 17:00

HOUSEKEEPING

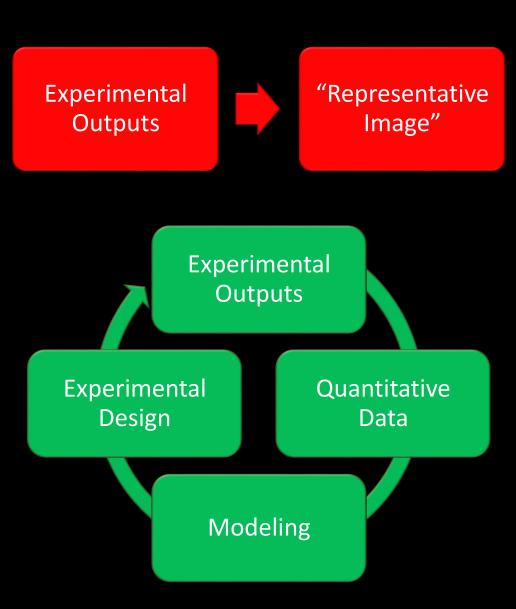
You don't need to take notes — I will send you the slides after the workshop

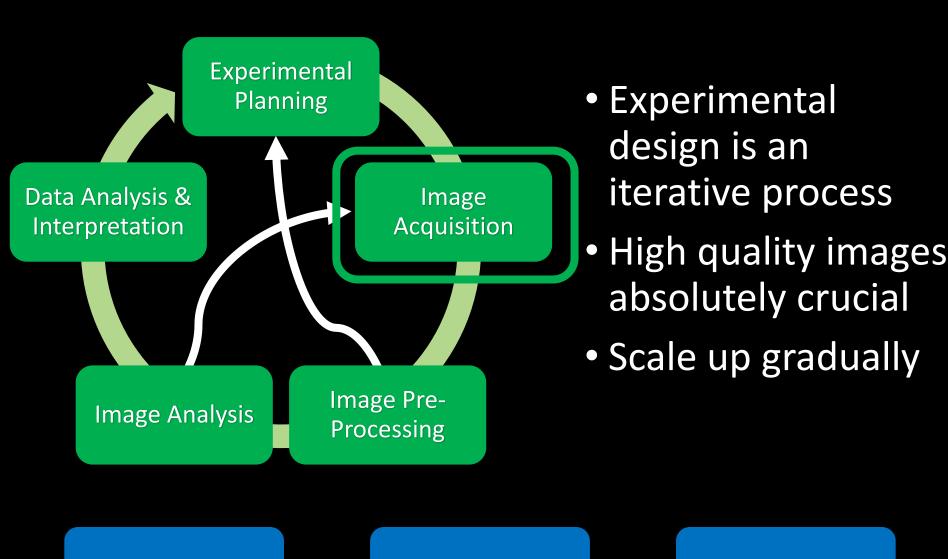
Please sign the sign-in sheet

Please feel free to ask questions

WHY USE QUANTITATIVE IMAGE ANALYSIS?

- Microscopy historically qualitative
- New technology facilitates quantification
- Limited uptake among biologists





Fixed coverslips



Live cell single well



Live cell multiwell

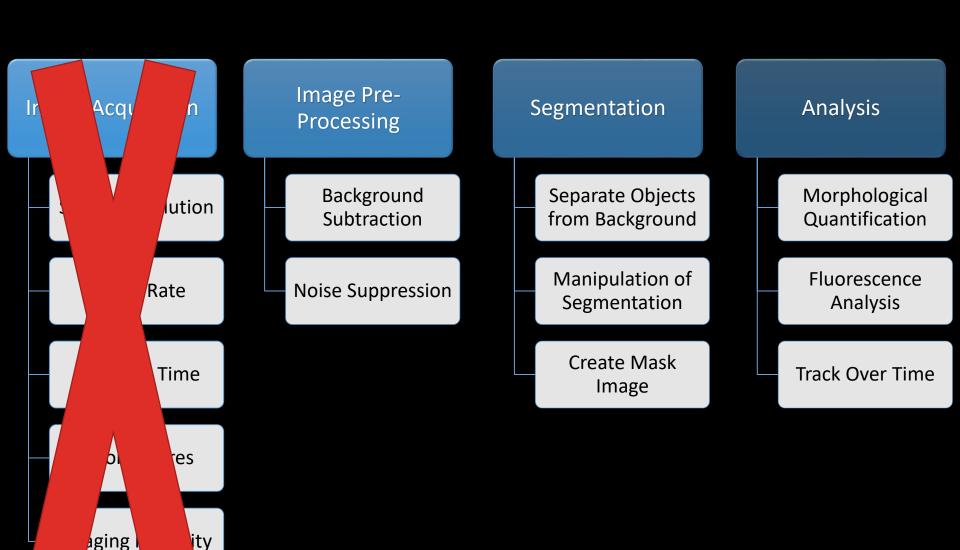
IMAGE ANALYSIS V IMAGE PROCESSING?

- Image Processing:
 - Enhancement, filtering for noise reduction, image registration, etc.
- Image Analysis:
 - Analysis of data contained within an image. For example, quantification of cell area.



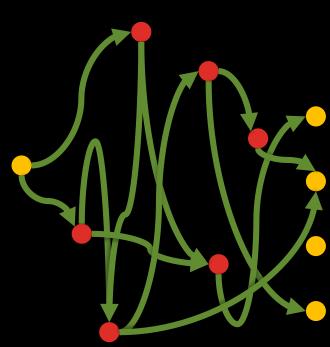
Processing should be kept to a minimum – reduces information content in image

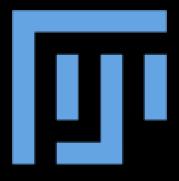
TYPICAL IMAGE ANALYSIS WORKFLOW



1. There are several different ways to arrive at a solution

2. There is rarely one single correct solution







- FIJI:
- Fiji Is Just ImageJ
- Actively maintained, with frequent updates.

ImageJ:

- Open source
- Public domain, crossplatform.
- Read most image formats (via bioformats).
- Same standard functions as proprietary packages.
- Open architecture.





home getting started download help about us

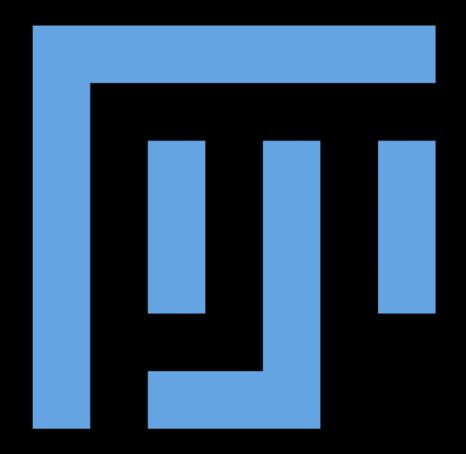


CellProfiler is free open-source software designed to enable biologists without training in computer vision or programming to quantitatively measure phenotypes from thousands of images automatically. See our papers on analyzing cell images and non-cell images.



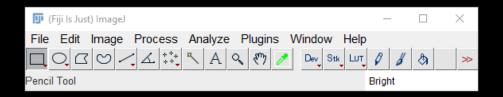
CellProfiler Analyst is free open-source software for exploring and analyzing large, high-dimensional image-derived data. It includes machine learning tools for identifying complex and subtle phenotypes. See our papers on data visualization and machine learning.

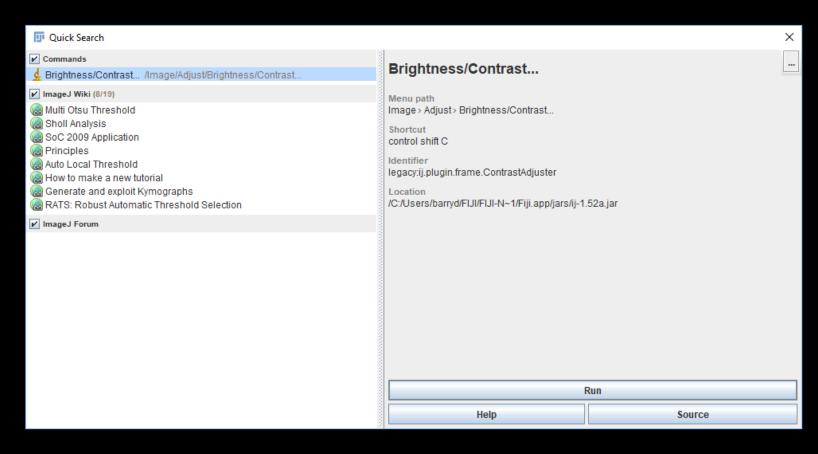




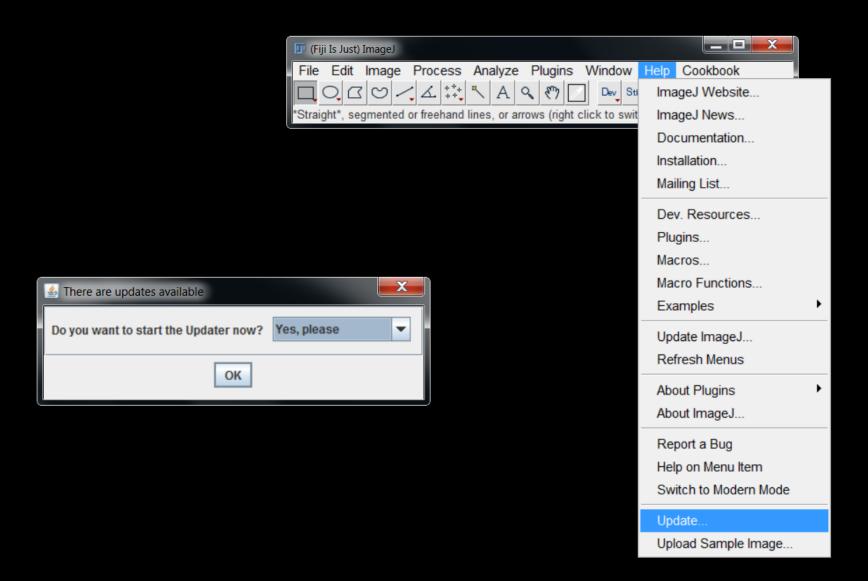
Let us begin...

IF YOU FORGET HOW TO ACCESS SOMETHING...



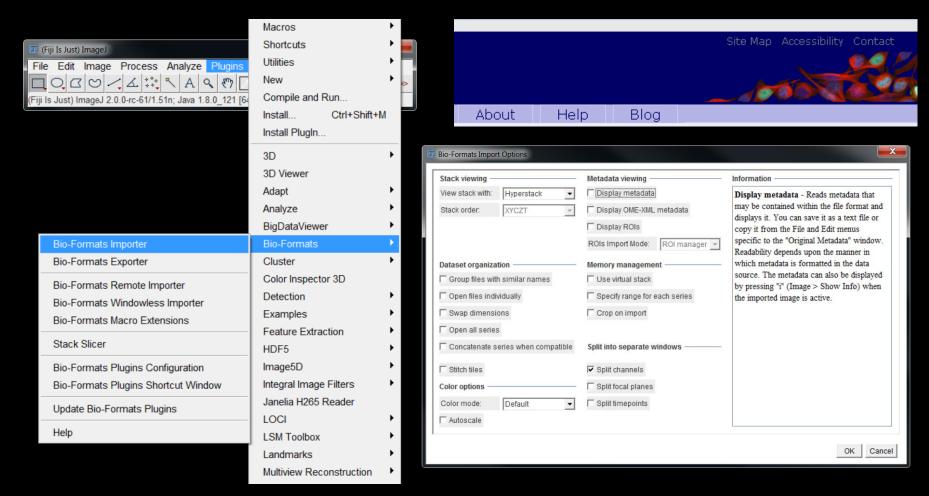


UPDATING FIJI



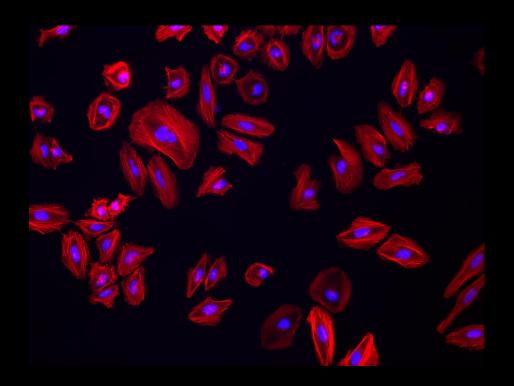
OPENING AN IMAGE

- Don't Drag & Drop
- Bioformats ensures consistent reading of metadata
 - Independent project distributed with FIJI

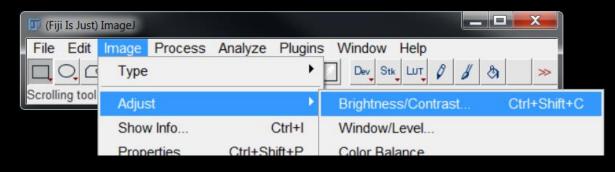


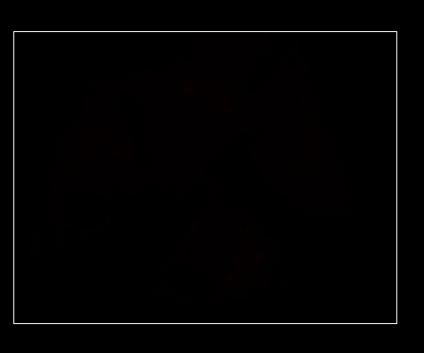
DEMO 1 – OPENING IMAGES WITH BIOFORMATS

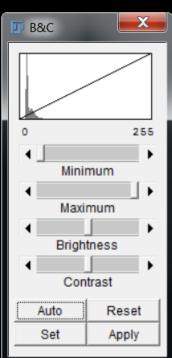
- Import Metamorph (TIFF) Dataset:
 - Overview of various options presented in Bioformats GUI
 - Illustration of reading of MetaData
 - Images can appear black, but pixels have values greater than zero



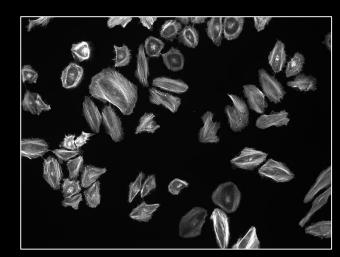
ADJUSTING CONTRAST



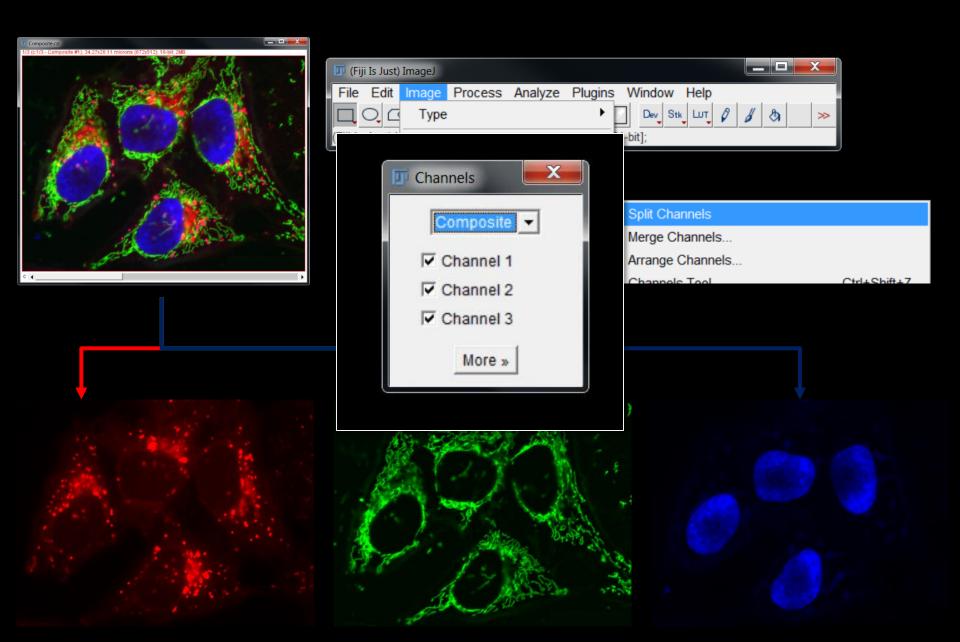






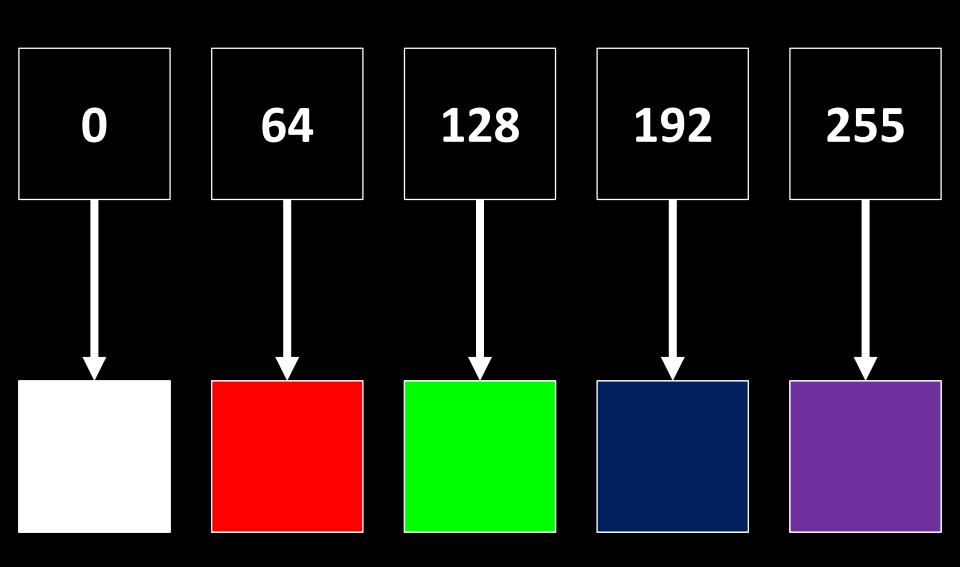


WORKING WITH CHANNELS

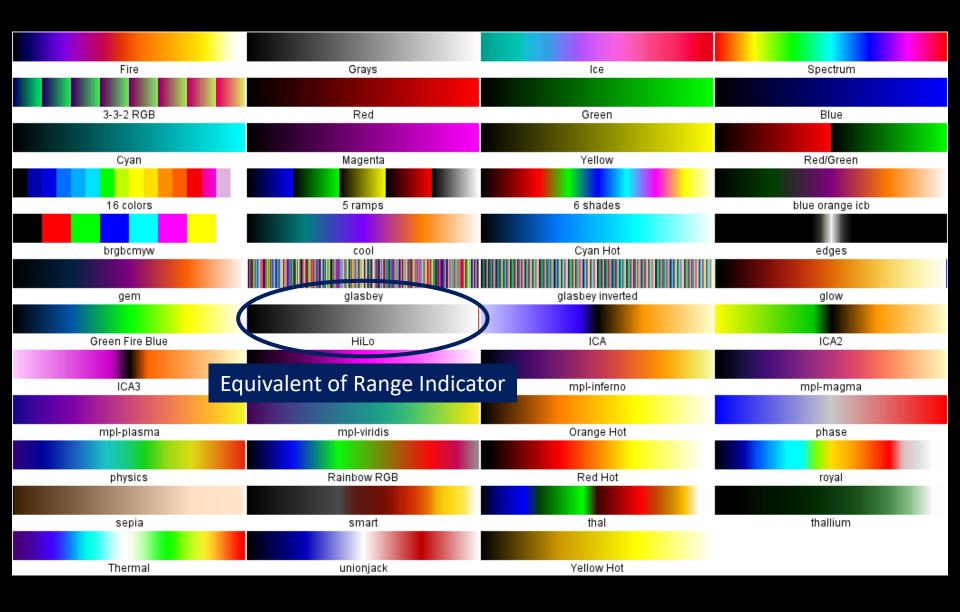


LOOK-UP TABLES (LUTS)

By default, pixel values are mapped to grey levels...



...but there is no reason why this has to be the case.



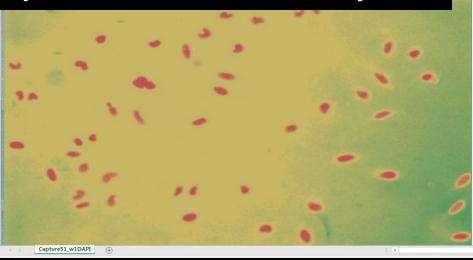
IMAGES ARE JUST NUMBERS

"Solutions to image analysis problems often appear simple, particularly when easily accomplished by the human visual system, which is complex and poorly understood."

The human brain is excellent at pattern matching...

...but this can result in us seeing "patterns" that don't really exist





THIS CAN CAUSE PROBLEMS...

Pareidolia is a psychological phenomenon in which the mind responds to a stimulus by perceiving a familiar pattern where none exists (e.g., in random data).





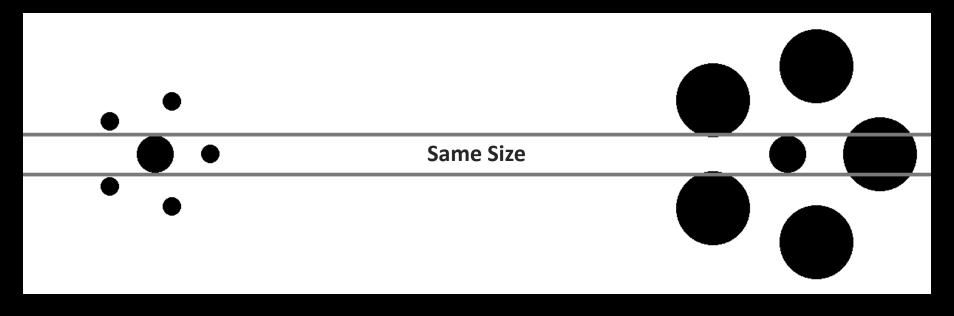
1976, Viking 1

2001, Mars Global Surveyor

Which nucleus is brighter?



Which centre circle is bigger?



WHAT'S YOUR POINT DAVE?!?!?

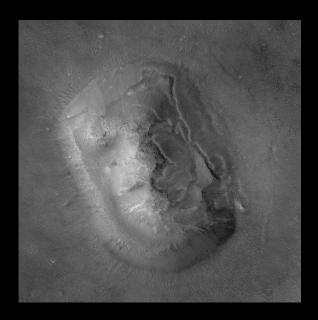
We're here to learn image analysis – you're preaching to the choir!

People will very often design an analysis pipeline to confirm what **they think they see** visually....

...which often results in significant frustration.



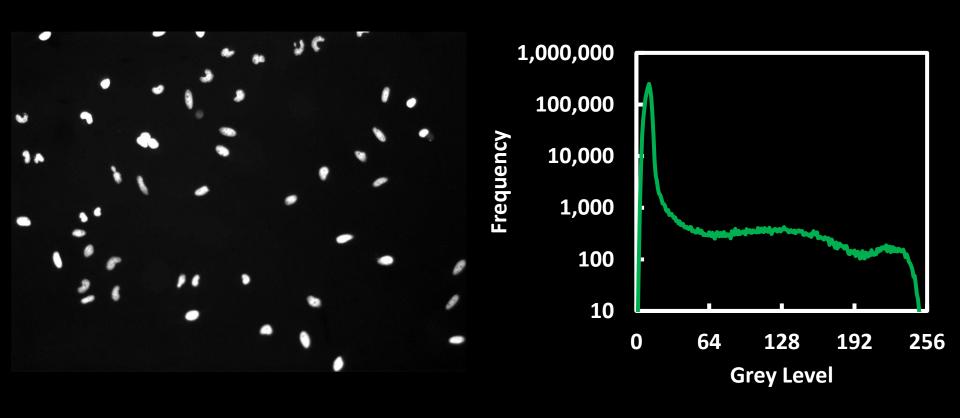
Expected Result: Humanoids on Mars



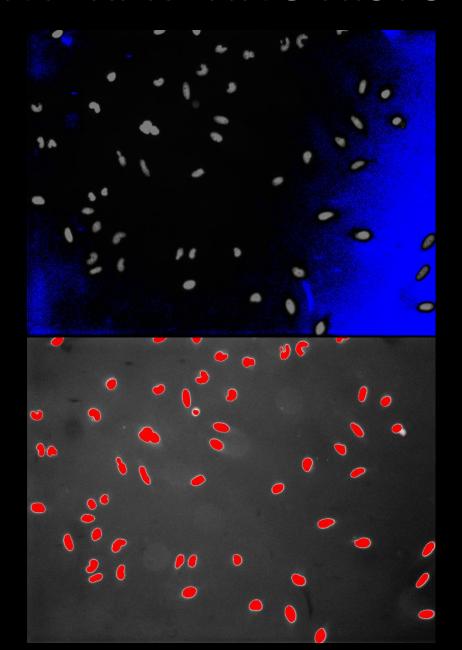
Actual Result: Big Rock

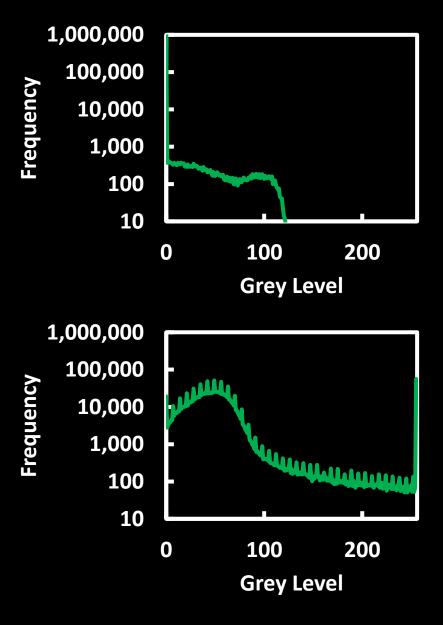
HISTOGRAMS

A graphical representation of the distribution of numerical data



INTERPRETING HISTOGRAMS

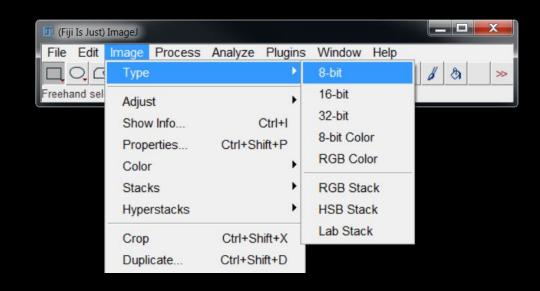




BIT DEPTH

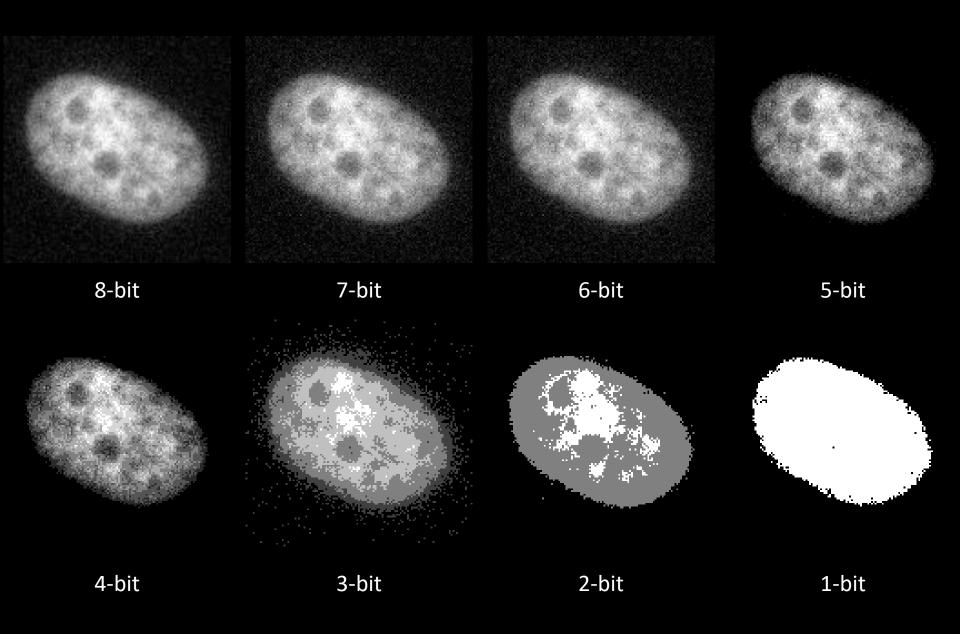
Range of values a pixel can represent

Bits per pixel	Number of values	Range of values
8	28	0 – 255
12	2 ¹²	0 – 4,095
16	2 ¹⁶	0 – 65,535
32	2 ³²	0 – 4,294,967,295



Greater bit depth means larger file sizes

REDUCING BIT DEPTH LOSES INFORMATION



DEMO 2 – MANIPULATING PIXEL VALUES

- Reducing bit depth incurs loss of data
- Best to deal with raw values
 - Operations performed more precise (e.g. lower rounding error)
- Compress for presentation

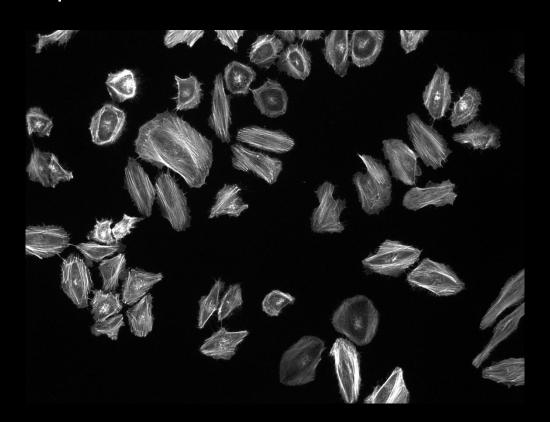


IMAGE COMPRESSION



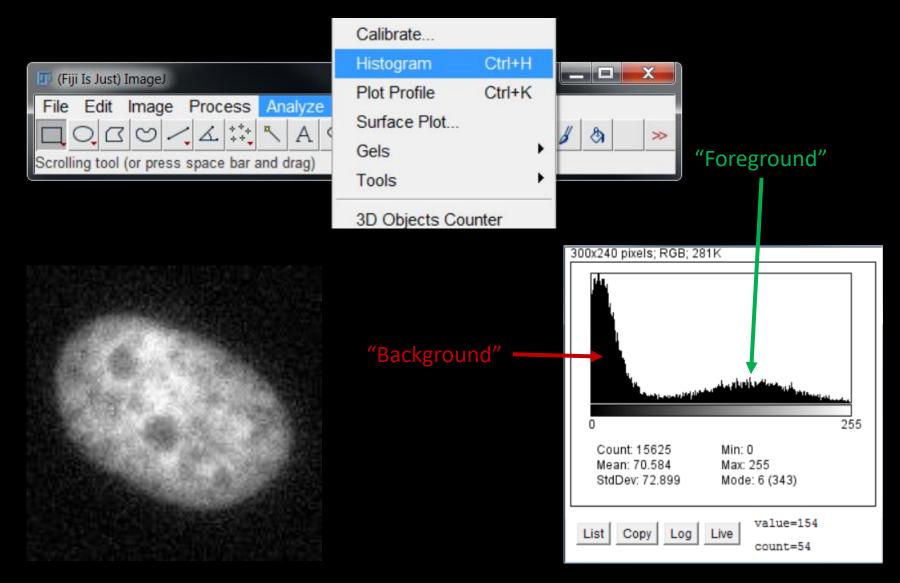
- Lossless:
 - All image information is preserved when saved.

Lossy Compression: Anything that changes pixel values



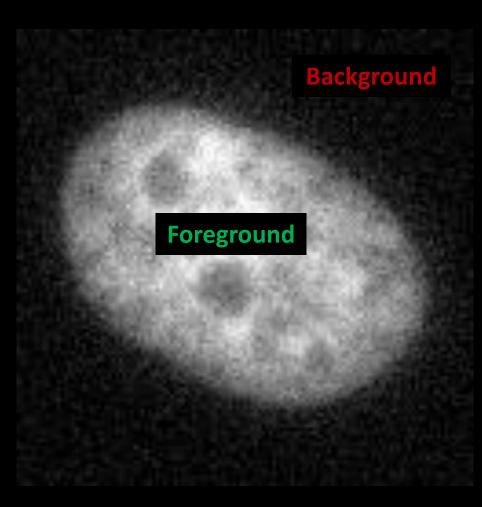
- Inage information is irretnevably lost when saved.
- JPEG, GIF
- Typically results in small file sizes

INTERPRETING HISTOGRAMS FURTHER



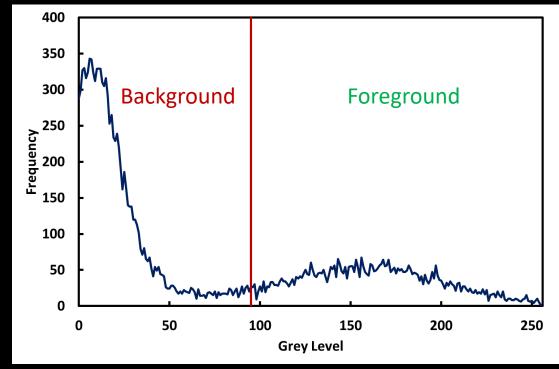
Can be exploited for segmentation

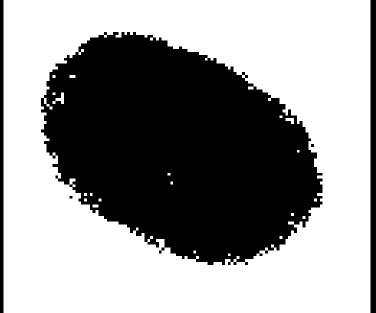
WHAT IS IMAGE SEGMENTATION?



- The process of dividing an image into different regions
- Assigning a label to each pixel within an image
- Pixels within a region should have similar properties

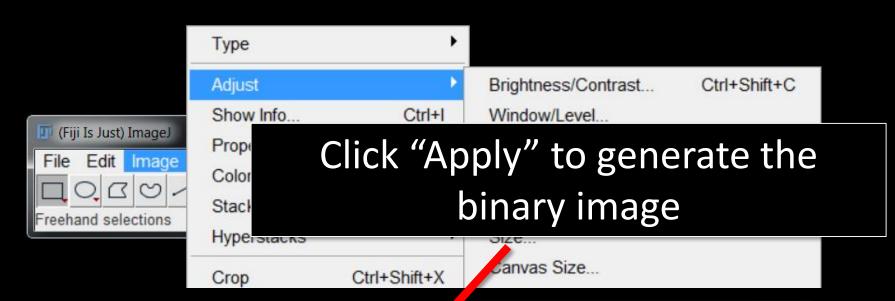


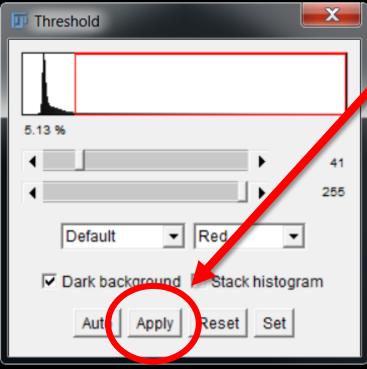


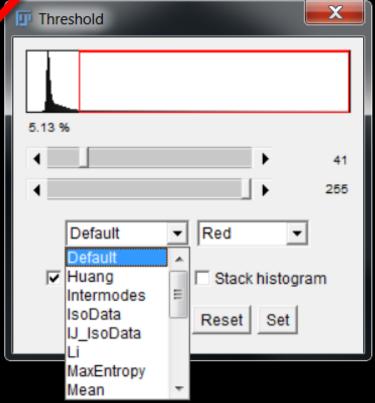


Average of Foreground Pixels + Average of Background Pixels

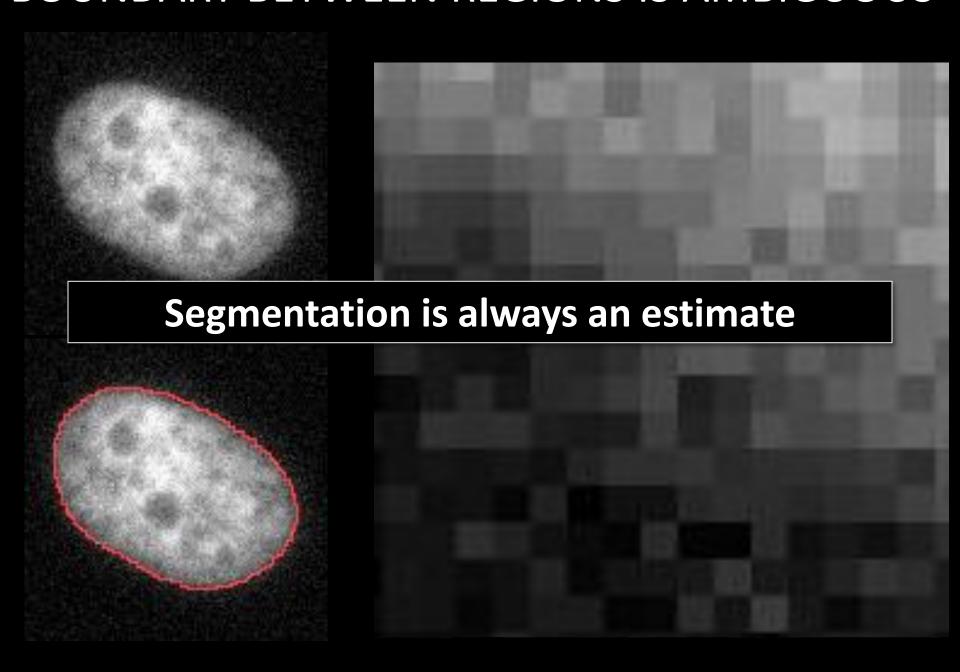
- FIJI has several variations on this algorithm
- Each produces different results
- Result referred to as binary (or mask) image



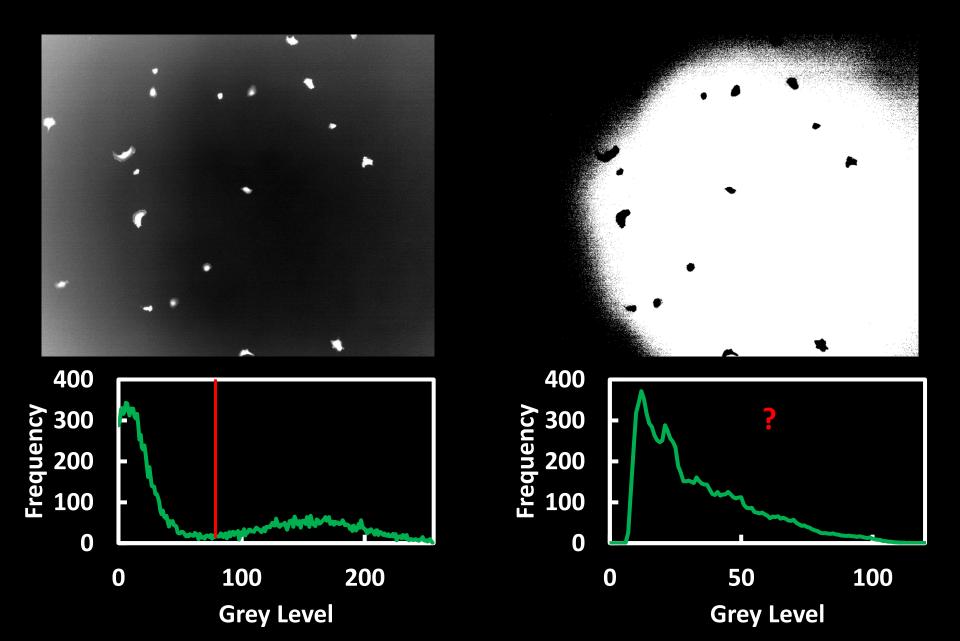




BOUNDARY BETWEEN REGIONS IS AMBIGUOUS

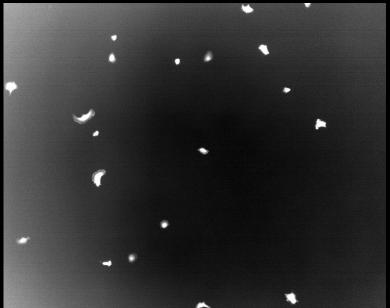


UNEVEN BACKGROUND POSES PROBLEMS



BACKGROUND SUBTRACTION







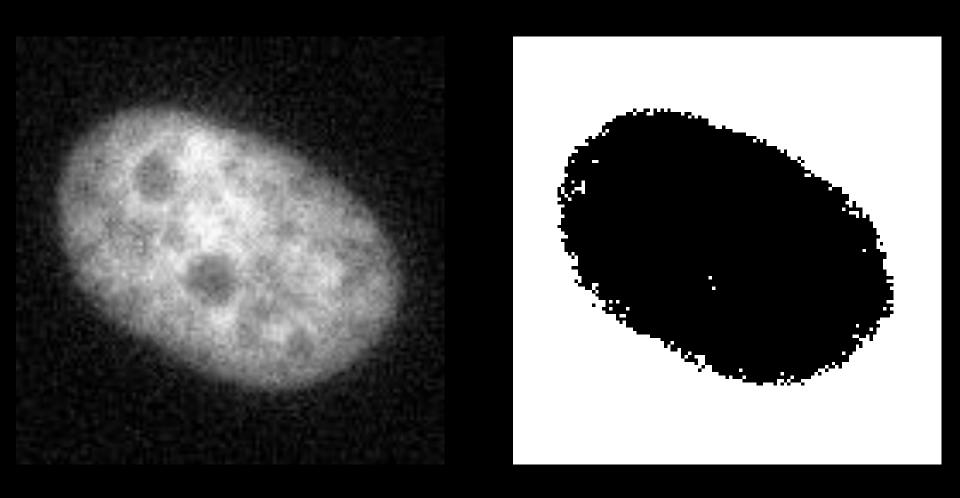
DEMO 4 – CORRECTING UNEVEN BACKGROUND

- Investigate influence of filter radius
- Background subtractor creates an estimate of background and removes from image



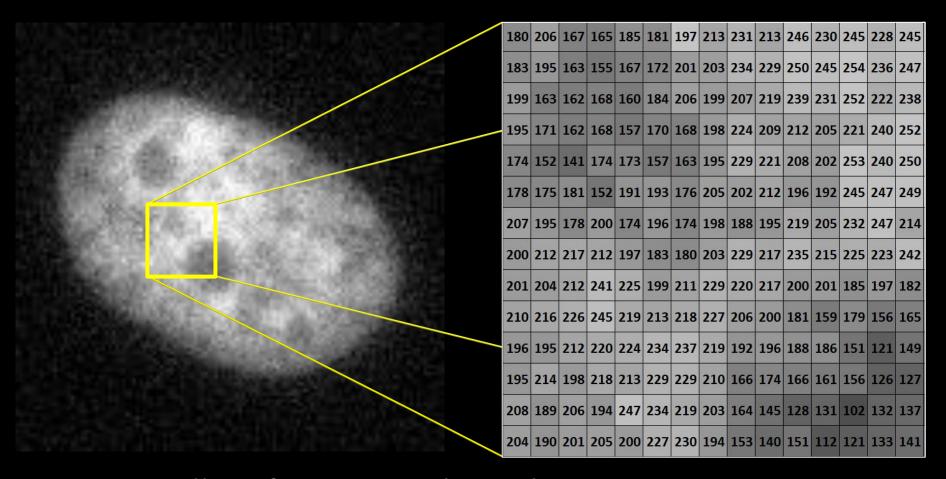


ANOTHER OBSTACLE TO "GOOD" SEGMENTATIONS IS SPECKLE NOISE...



Filtering can be employed to improve segmentation

WHAT IS FILTERING?



 Generally refers to simple arithmetic operations on small numbers of pixels

MEAN/AVERAGING FILTERING

243	185	185	243	185	185
19	246	105	19	172	105
225	221	119	225	221	119

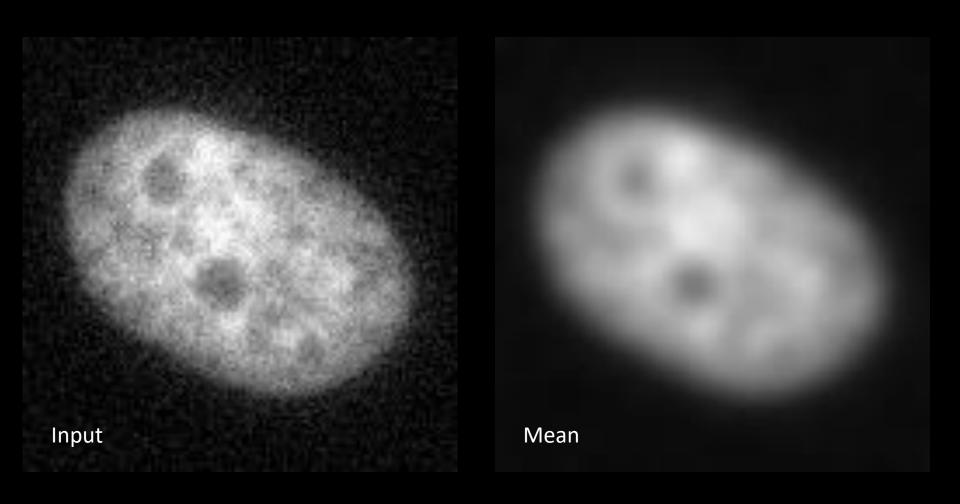
Replaces central value with average of all values

FILTERING IN ACTION

168	186	192	197	199	202	201	196	196	202	206	208	214	228	224	220	223	212	206	205	182	185	194	197	203	208	210	208	206	207	210	213	215	215	212	209	205	201	197	195
177	196											ا اننا				المنسر			الشند	184	187	194	197	205	212	216	215	212	212	214	213	210	205	200	196	191	188	185	184
184	193	194	198	203	225	231	227	224	223	221	217	201	181	178	168	161	167	160	163	187	190	196	198	207	216	224	224	221	219	215	208	198	189	179	173	167	164	164	163
180	193	200	196	198	221	225	224	227	224	212	196	180	170	166	151	146	142	138	148	189	191	195	198	206	216	224	227	226	221	211	197	183	173	163	155	149	146	146	146
191	192	188	197	205	214	226	226	234	228	199	177	169	160	148	141	133	132	132	136	193	194	195	198	204	213	221	226	227	220	204	185	171	161	152	143	137	134	135	135
202	200	196	197	202	210	220	222	228	230	201	169	160	156	143	131	127	130	125	131	200	198	197	199	204	210	215	221	223	215	197	176	162	153	143	135	131	128	129	128
214	203	196	200	208	199	210	210	217	209	193	164	153	149	135	127	128	130	119	124	207	203	200	200	201	204	205	209	210	204	187	168	154	145	136	130	127	125	125	123
217	204	198	204	198	195	190	192	194	187	175	153	142	137	130	120	128	125	117	122	207	203	199	199	199	197	194	195	194	188	174	159	146	137	130	125	124	122	120	119
208	198	189	196	201	188	180	180	179	175	163	144	140	129	120	121	117	116	114	115	203	199	195	194	193	189	186	185	182	175	163	150	139	130	124	121	119	118	116	115
198	191	187	184	186	181	182	184	180	166	159	145	133	126	117	118	116	113	112	108	193	191	187	187	187	186	184	185	182	173	158	145	134	126	120	117	116	115	113	113
184	180	180	178	184	182	189	192	202	180	152	138	130	119	117	110	117	112	115	113	184	183	181	181	181	183	186	192	189	179	160	145	133	125	119	116	115	114	113	113
174	175	175	175	180	178	189	199	209	193	167	142	136	130	121	116	116	113	116	112	175	175	175	177	178	181	186	194	198	189	170	151	139	131	125	121	118	117	115	114
167	169	171	174	176	177	173	192	204	212	184	162	146	144	137	129	126	124	116	113	170	171	173	175	177	179	184	192	200	195	181	163	150	141	135	129	124	120	117	116
163	171	173	171	182	179	179	186	196	205	188	177	161	150	148	139	128	122	119	119	169	171	173	175	176	177	180	187	196	196	189	174	162	152	145	137	131	126	123	122
167	179	177	175	177	174	180	184	190	194	194	182	173	162	150	145	134	132	132	130	173	175	178	178	177	177	178	182	188	191	188	180	170	159	150	142	137	133	132	130
172	185	186	183	176	175	171	172	180	185	184	183	179	161	148	143	142	148	141	141	178	180	182	180	176	174	174	176	180	183	182	178	172	164	156	149	147	145	145	144
178	184	188	181	175	169	167	170	173	173	174	167	168	169	164	159	157	160	156	161	179	181	183	180	174	170	168	170	173	174	173	171	170	167	164	161	161	161	164	164
174	180	183	174	170	161	163	167	164	169	161	161	163	175	180	179	176	181	191	194	176	177	177	174	168	165	165	166	168	168	166	165	168	173	175	175	174	177	182	185
169	170	168	167	159	160	159	165	170	164	161	160	171	177	189	185	182	190	203	205	168	168	167	165	162	161	162	165	166	165	163	163	168	176	181	182	183	189	198	203
160	157	153	154	157	158	164	163	169	166	160	161	167	178	185	181	183	190	209	217	164	163	162	160	159	160	162	165	166	165	162	163	169	178	183	184	185	193	202	209

Input Output

MEAN FILTERING "BLURS" NOISE



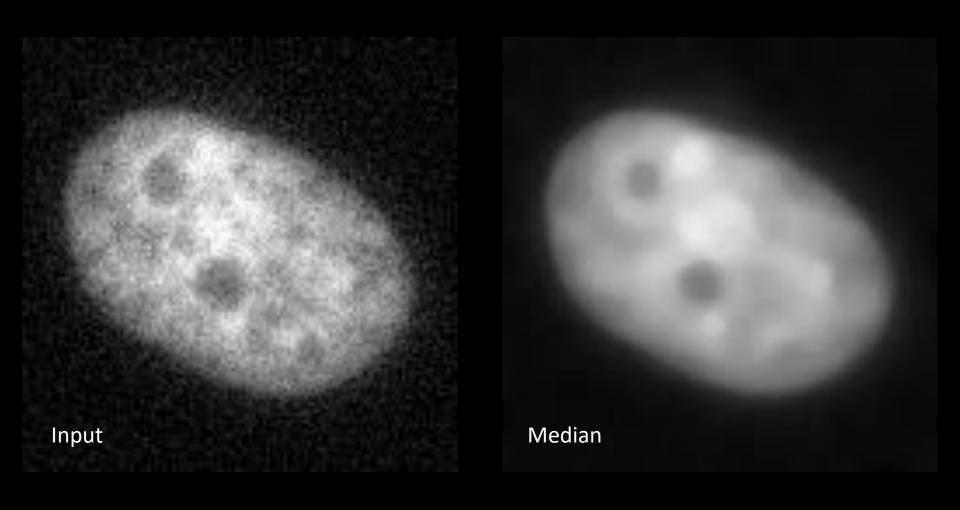
But remember, information is also lost!

MEDIAN FILTERING

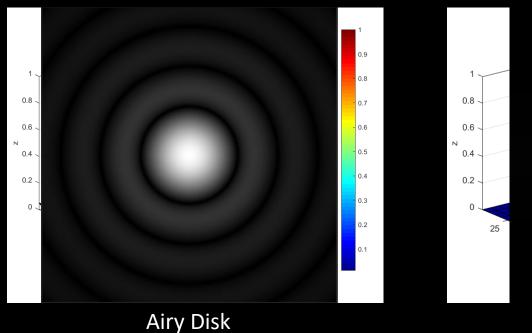
243	185	185	243	185	185
19	246	105	19	185	105
225	221	119	225	221	119

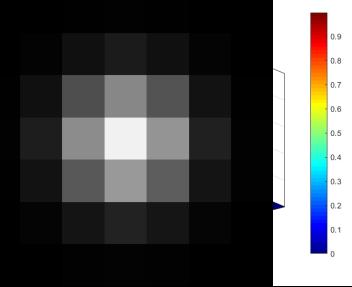
Replaces central value with median value

MEDIAN FILTERING PRESERVES EDGES



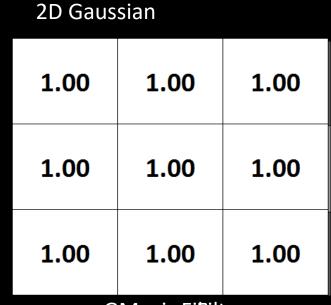
GAUSSIAN FILTERING



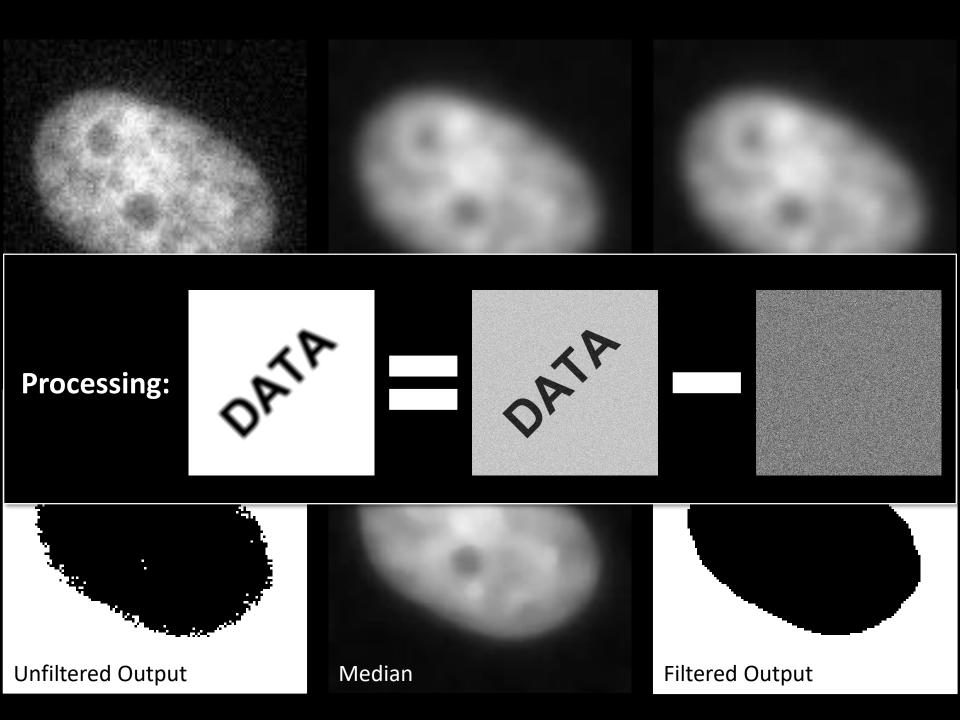


Approximation of Airy Disk

Essentially a weighted mean filter



Galdeaira Fiftietter

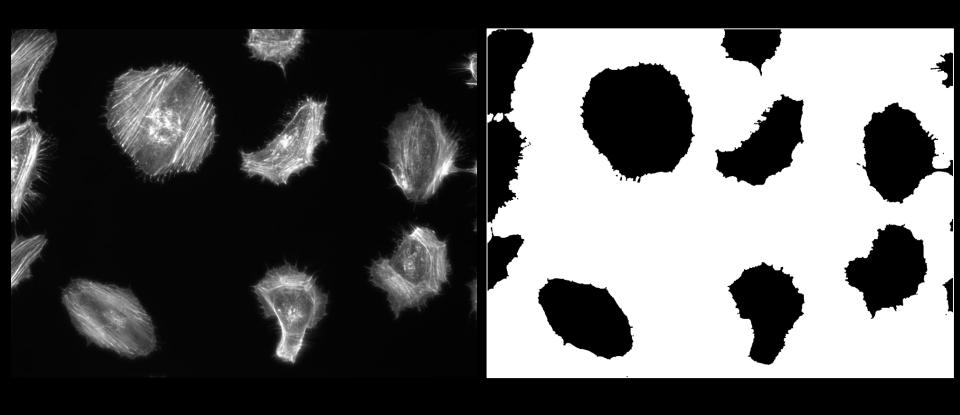


DEMO 5 - FILTERS

- Notice the effect of varying filter radius
- Observe the difference in edge preservation between mean and median filters

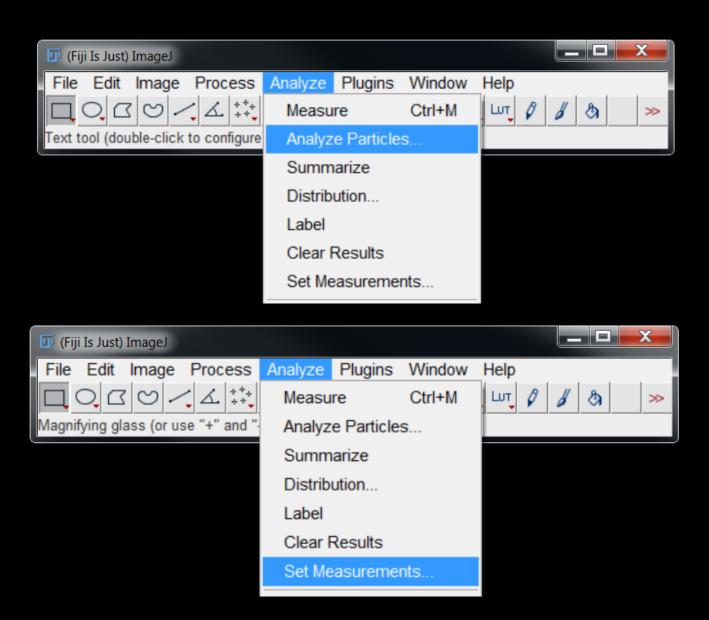


MORPHOLOGICAL ANALYSIS



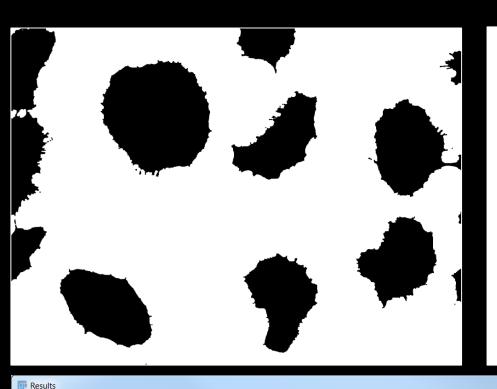
How do we extract numerical data from segmented images?

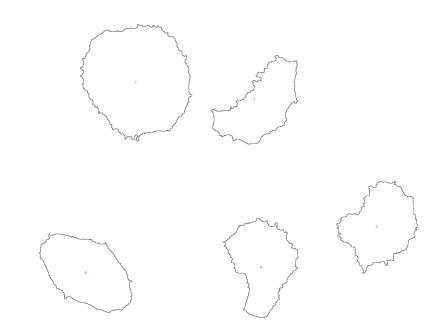
MORPHOLOGICAL ANALYSIS



Set Measurements	X
I ▽ [Area]	✓ Mean gray value
Standard deviation	Modal gray value
Min & max gray value	Centroid
Center of mass	Perimeter
☐ Bounding rectangle	☐ Fit ellipse
Shape descriptors	Feret's diameter
Integrated density	☐ Median
Skewness	☐ Kurtosis
☐ Area fraction	Stack position
Limit to threshold	□ Display label
☐ Invert Y coordinates	Scientific notation
Add to overlay	□ NaN empty cells
Redirect to:	None ▼
Decimal places (0-9):	3
	OK Cancel Help

Analyze Particles	X
Size (micron^2): Pixel un Circularity:	
Show:	Nothing
☐ Display results ☐ Clear results ☐ Summarize ☐ Add to Manage	Exclude on edges Include holes Record starts In situ Show OK Cancel Help





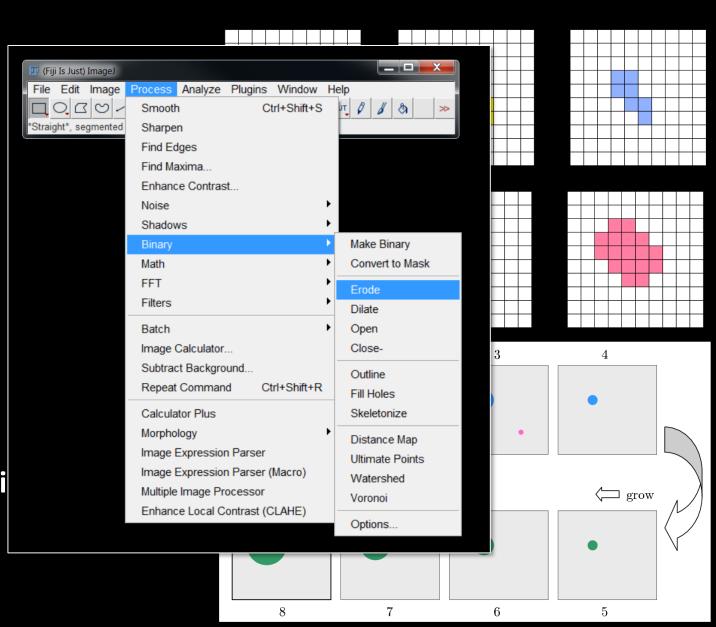
igo Re	Suits																				
File	Edit F	Font Resu	lts																		
	Area	X	Υ	XM	YM	Perim.	BX	BY	Width	Height	Major	Minor	Angle	Circ.	Feret	IntDen	RawIntDen	FeretX	FeretY	FeretAngle	MinFo
1	88461	452.335	269.404	452.335	269.404	1385.894	277	99	343	360	351.863	320.102	126.303	0.579	371.602	22557555	22557555	311	146	130.635	324.8
2	37578	833.182	346.780	833.182	346.780	1097.744	681	195	265	273	311.118	153.787	46.201	0.392	332.182	9582390	9582390	684	419	38.768	181.8
3	41450	1201.315	717.108	1201.315	717.108	1062.590	1067	582	248	283	260.470	202.617	55.433	0.461	300.483	10569750	10569750	1147	865	70.359	216.0
4	40950	837.361	834.134	837.361	834.134	1044.815	718	696	230	306	281.859	184.983	95.828	0.471	306.863	10442250	10442250	820	696	94.298	213.8
5	45631	296.057	861.770	296.057	861.770	949.034	151	744	285	242	316.443	183.601	145.191	0.637	329.509	11635905	11635905	155	776	146.889	206.4

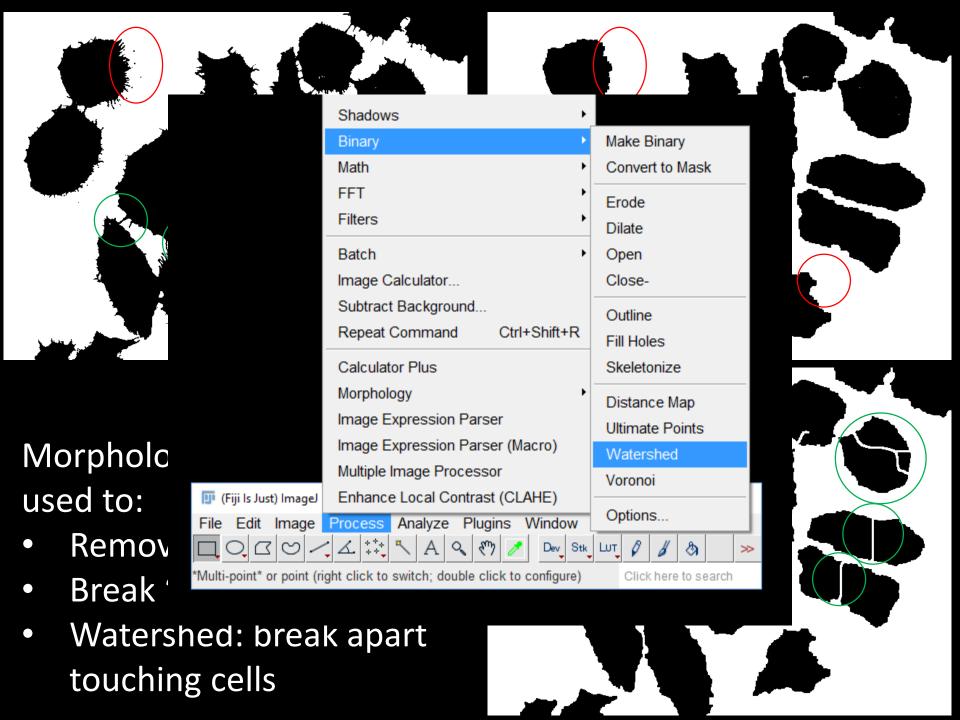
MORPHOLOGICAL FILTERING

Erosion

Dilation

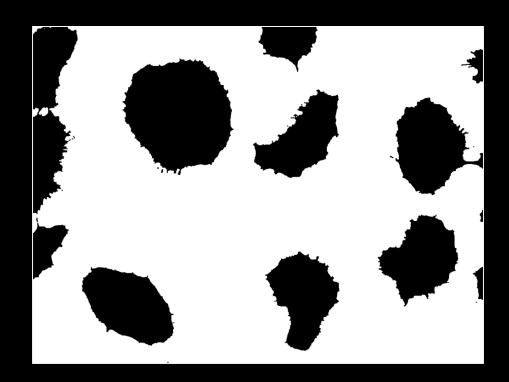
Erosion + Dilati



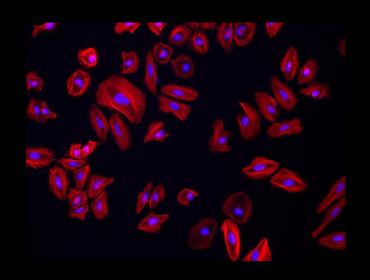


DEMO 6 – WORKING WITH BINARY IMAGES

- Demo particle analyser and morphological filters
- Show how to specify background colour for analyser



CHALLENGE 1



- 1. Count the number of cells
- 2. Estimate the mean cell area

Note: You may find it helpful to duplicate and/or rename images as you work

ŀ	Fil.	te	er	Ν	lo	is	e

Process > Filters

Segment Cells From Background

Image > Adjust > Threshold

Manipulate Segmentation

Process > Binary

Specify Morphological Measurements

Analyze > Set Measurements

Quantify Morphology

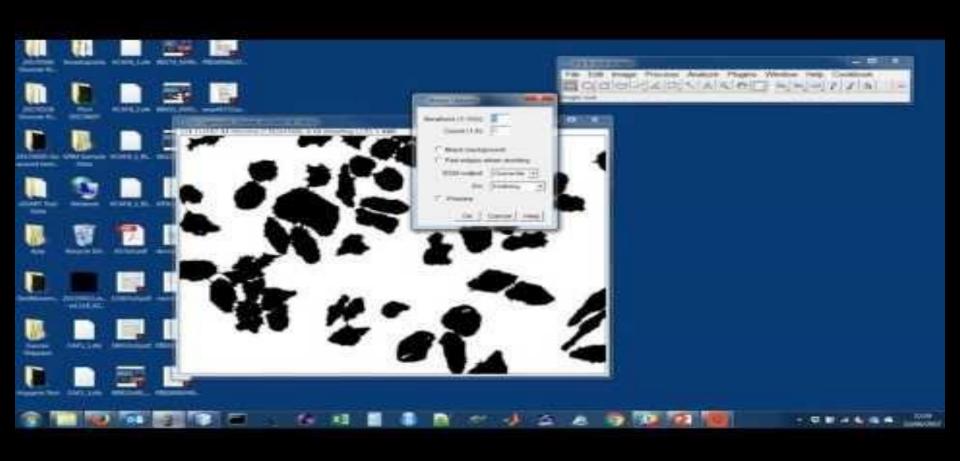
Analyze > Analyze Particles

CHALLENGE 1

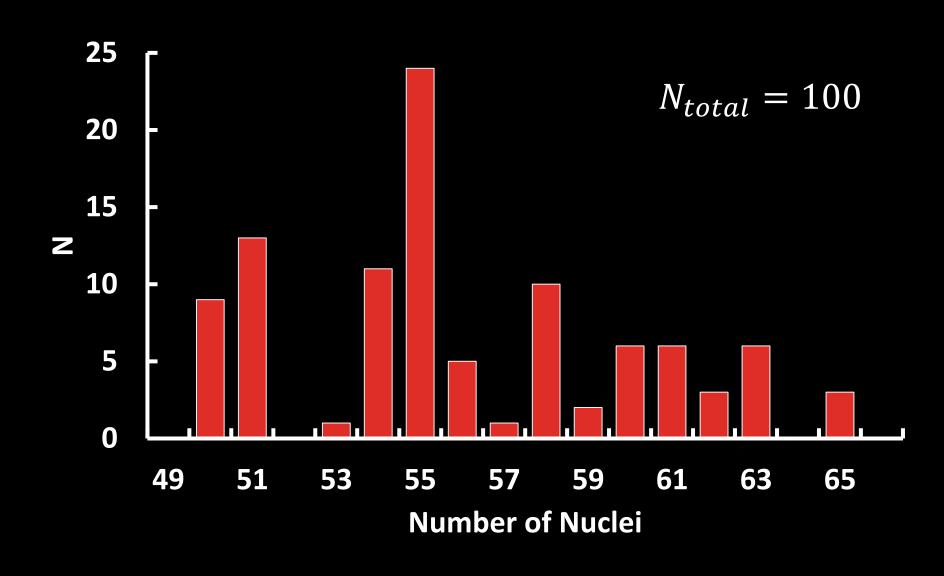
Filter Noise	Process > Filters
Segment Cells From Background	Image > Adjust > Threshold
Manipulate Segmentation	• Process > Binary
Specify Morphological Measurements	Analyze > Set Measurements
Quantify Morphology	Analyze > Analyze Particles

- Which variables in your analysis pipeline will have the greatest impact on your result?
- Could the images be improved in any way to facilitate easier analysis?
- Can you think of an alternative approach?

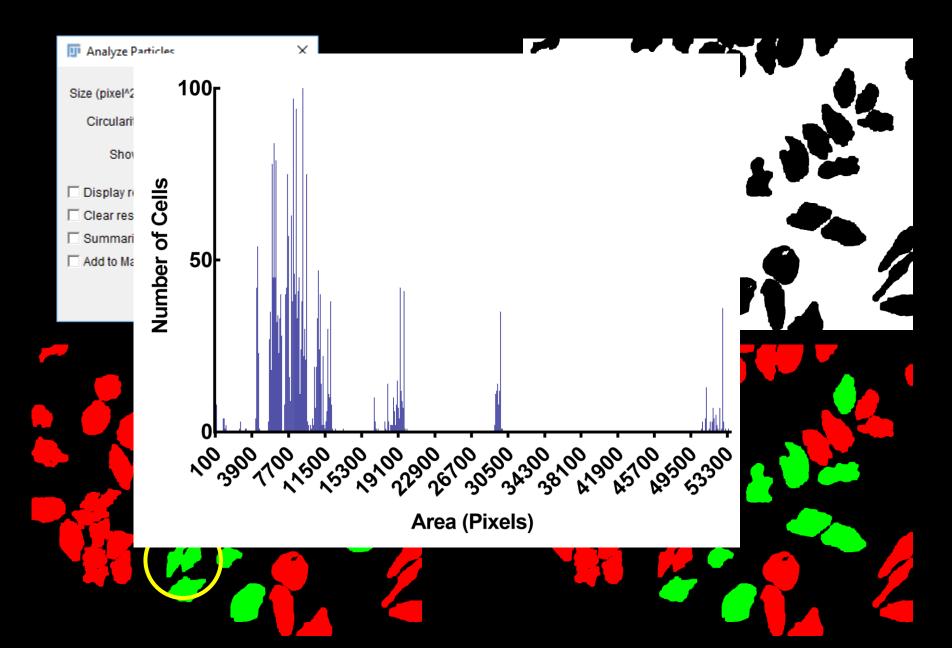
SOLUTION TO CHALLENGE 1



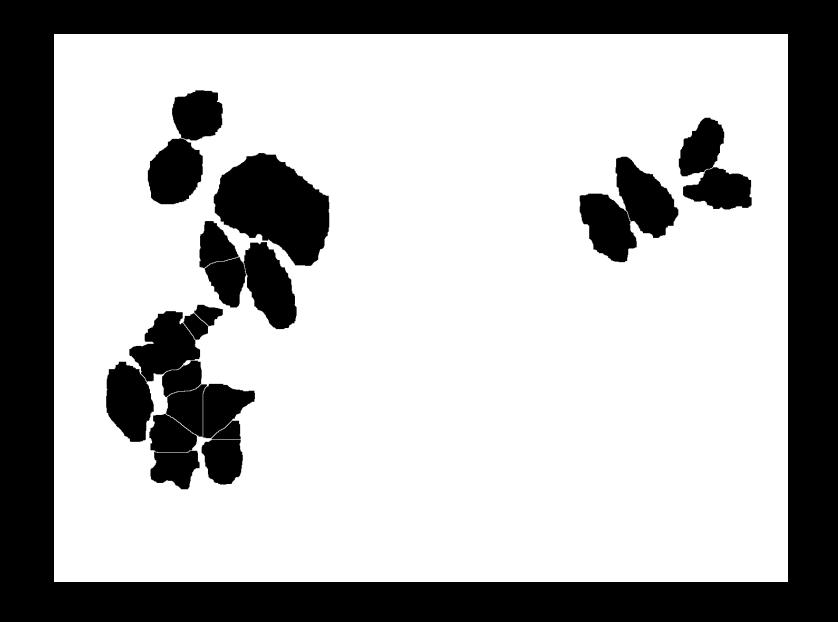
HOW DO PARAMETER VALUES AFFECT THE RESULT?



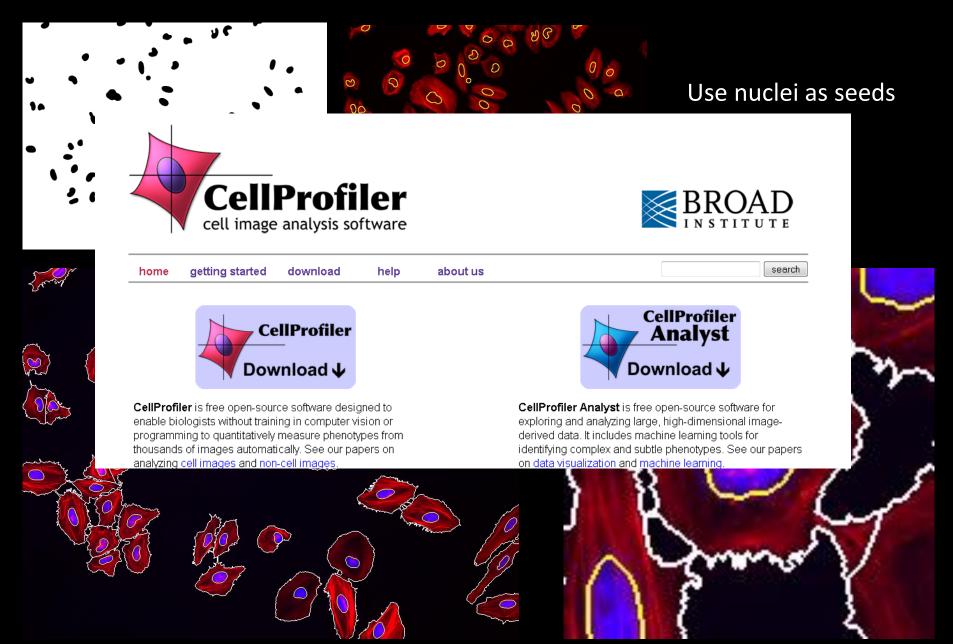
USING MORPHOLOGICAL CRITERIA



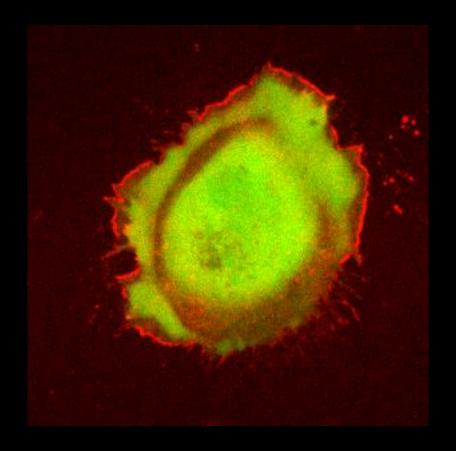
REPEAT ANALYSIS ON CLUMPED CELLS



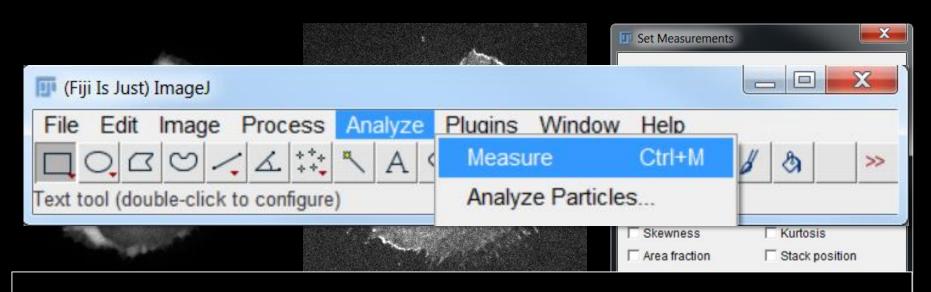
ALTERNATIVE APPROACH: REGION-GROWING



ANALYSING MULTIPLE CHANNELS



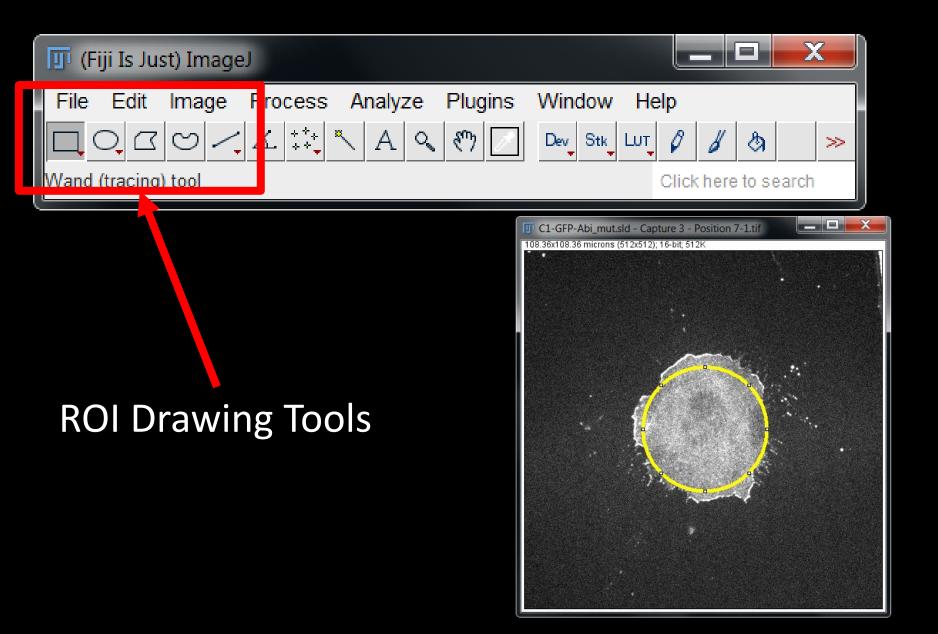
What if we want to analyse protein expression?



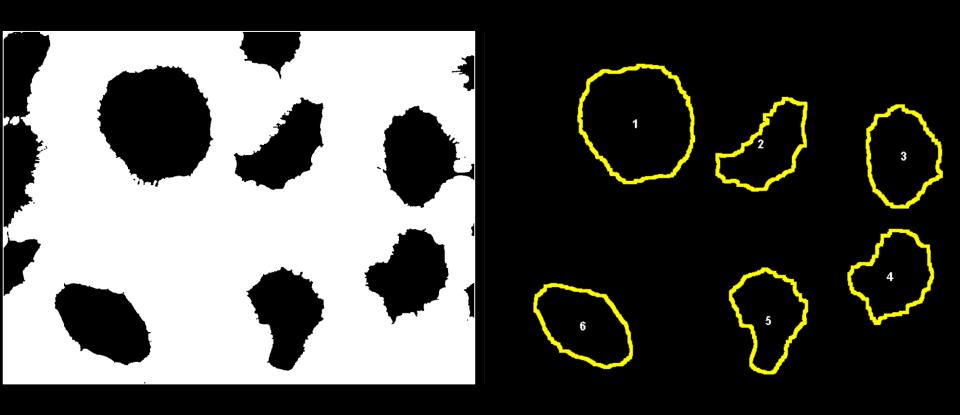
FIJI restricts measurements to within Regions of Interest (ROIs)

- 1. Generate an ROI
- 2. Apply ROI to image
- 3. Measure the pixel values in the image within the ROI

IT'S POSSIBLE TO SPECIFY ROIS MANUALLY

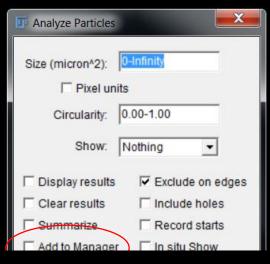


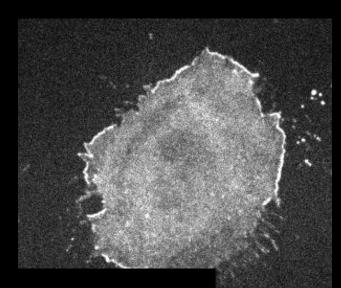
PARTICLE ANALYSER GENERATES ROIS "BEHIND THE SCENES"



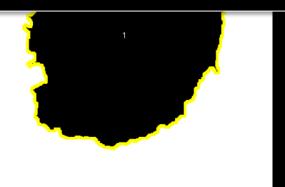
Masks and ROIS can be considered interchangeable

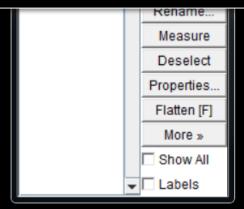


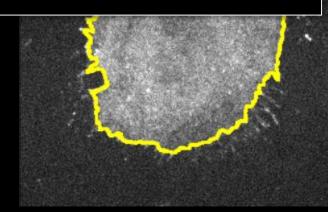




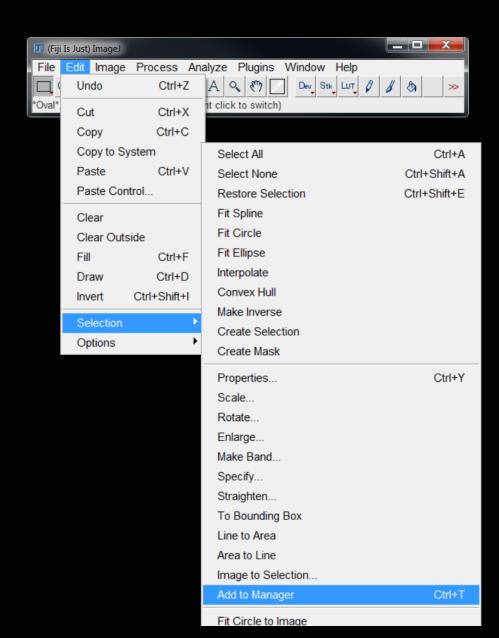
- 1. Using Particle Analyser to generate an ROI
- 2. Apply ROI to image
- 3. Measure the pixel values in the image within the ROI

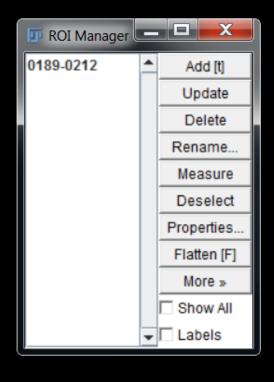






ROI MANAGER CAN ALSO BE ACCESSED MANUALLY...

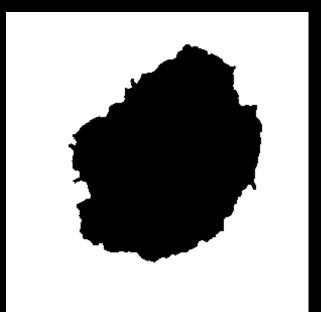




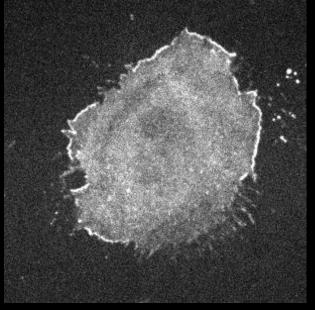
DEMO 7 – GENERATING ROIS AUTOMATICALLY

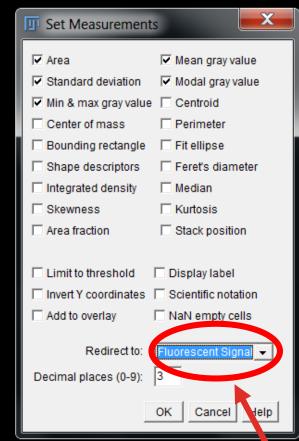
Demonstration of Particle Analyser's ability to generate regions of interest

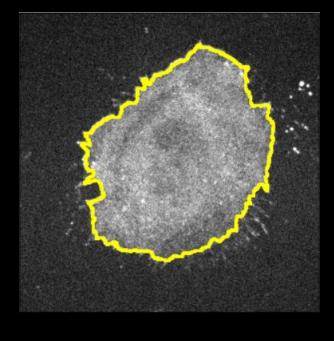
- 1. Using Particle Analyser to generate an ROI
- 2. Apply ROI to image
- 3. Measure the pixel values in the image within the ROI



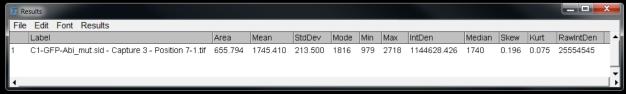
Binary Mask





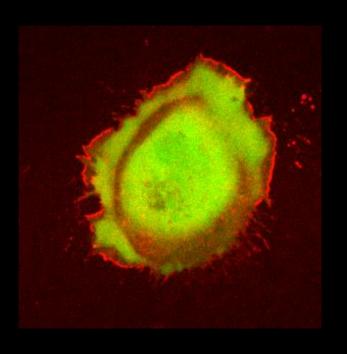


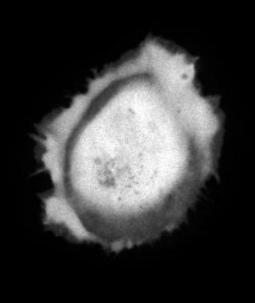
FIJI will always apply measurements to whatever image is specified here

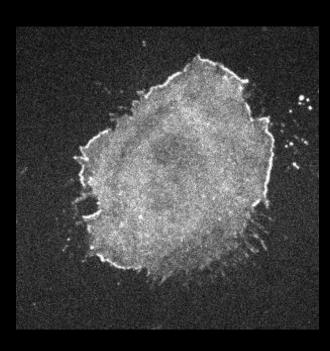


DEMO 8 – QUANTIFYING FLUORESCENCE

Demonstration of Particle Analyser's ability to apply ROIs to measure grey levels







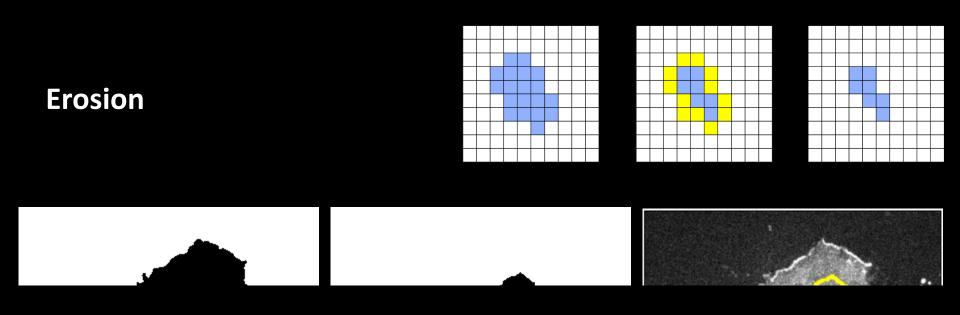
WHAT IF WE WANT TO EXAMINE DIFFERENCES IN PROTEIN EXPRESSION...

<u>hetween here</u>

Require two different ROIs

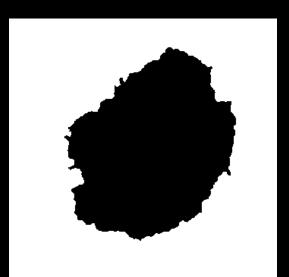
- 1. Generate an ROI
- 2. Duplicate ROI and manipulate in some way
- 3. Apply ROIs to image, one at a time
- 4. Measure the pixel values in the image within the ROIs

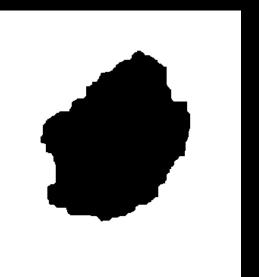
POSSIBLE TO MANIPULATE MASK PRIOR TO ROI GENERATION

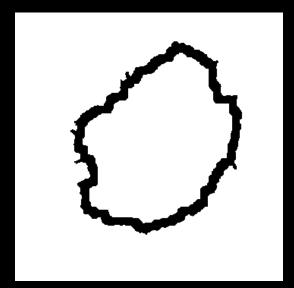


How do we generate a mask to represent the cell boundary?

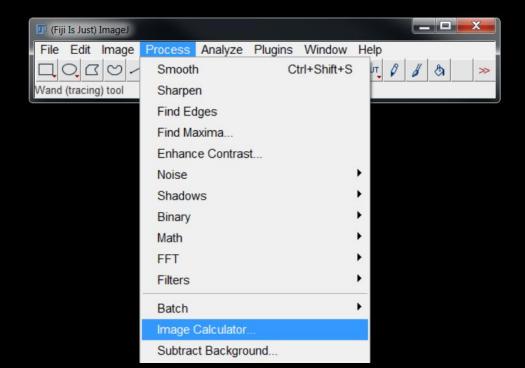








Calculate difference between these...

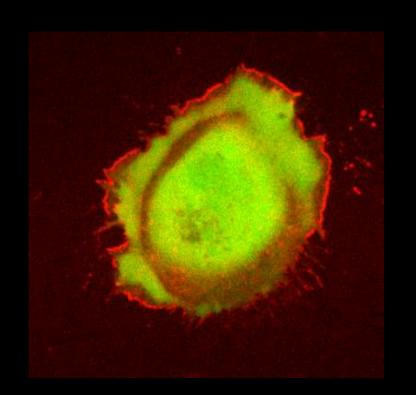


...to produce this.

Image Calculator		
Image1:	mask 🔻	
Operation:	Add	₹
Image2:	OR XOR	
	Min Max Average	
☐ 32-bit	Difference	E
OK	Transparent-zero	1

CHALLENGE 2

Estimate the difference in mCherry expression between the cell edge and the cell centre



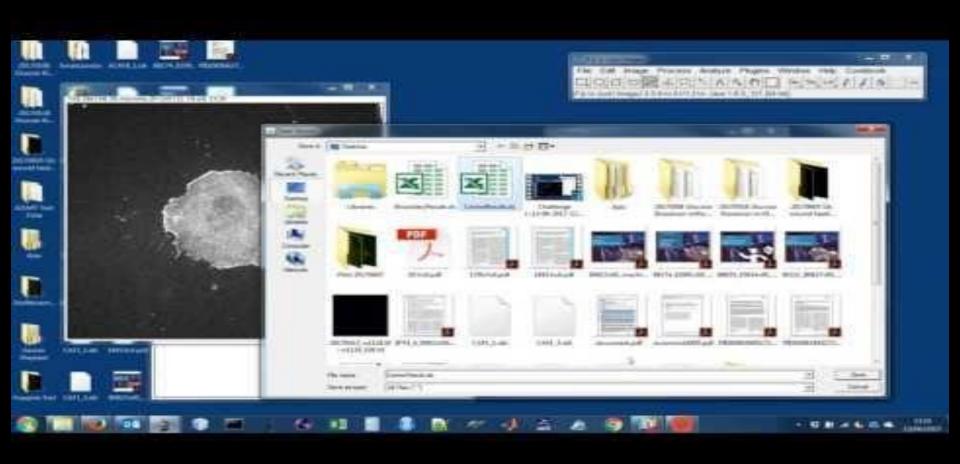
Filter Noise	• Process > Filters
Segment cells from background	• Image > Adjust > Threshold
Manipulate Segmentation	• Process > Binary
Create New Mask Image	Process > Image Calculator
Specify Morphological Measurements	Analyze > Set Measurements
Quantify Morphology & Fluorescence	Analyze > Analyze Particles

CHALLENGE 2

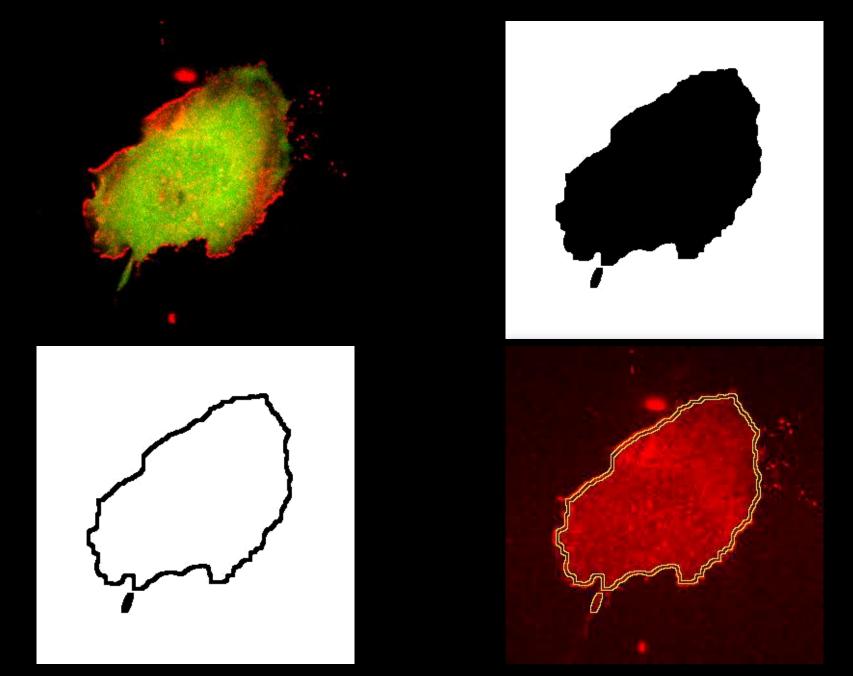
Filter Noise	• Process > Filters
Segment cells from background	• Image > Adjust > Threshold
Manipulate Segmentation	• Process > Binary
Create New Mask Image	Process > Image Calculator
Specify Morphological Measurements	Analyze > Set Measurements
Quantify Morphology & Fluorescence	Analyze > Analyze Particles

- Which variables in your analysis pipeline will have the greatest impact on your result?
- Is the result what you expected?
 - Why?
 - What could explain any discrepancy between what you see "visually" and what you obtain quantitatively.

SOLUTION TO CHALLENGE 2



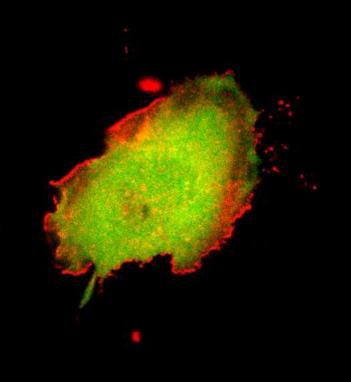
Everything we have done can also be applied to 3- & 4-D datasets



CHALLENGE 3

Quantify Morphology & Fluorescence

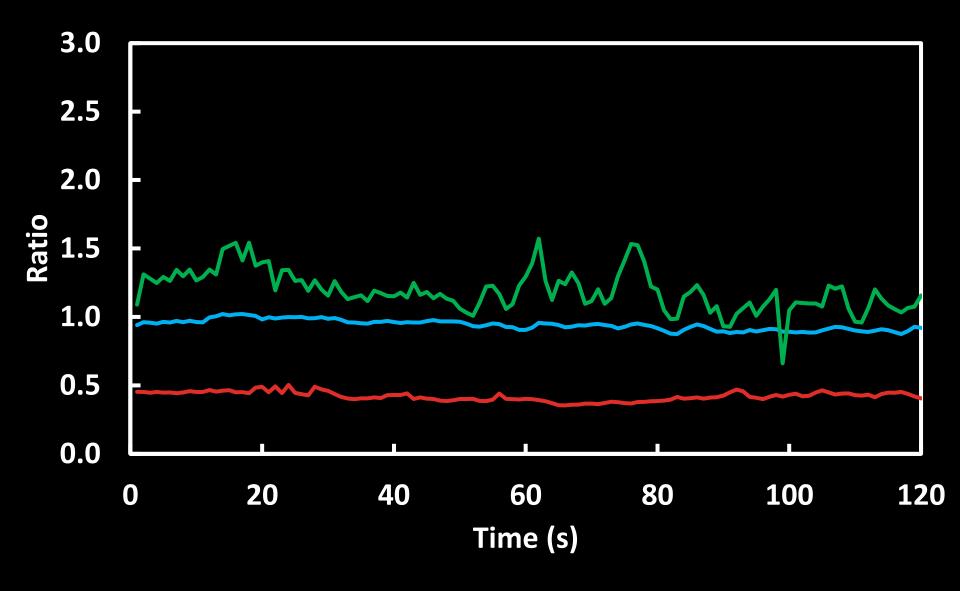
Determine whether mCherry localisation varies over time



Filter Noise	Process > Filters
Segment cells from background	Image > Adjust > Threshold
Manipulate Segmentation	• Process > Binary
Create New Mask Image	Process > Image Calculator
Specify Morphological Measurements	Analyze > Set Measurements

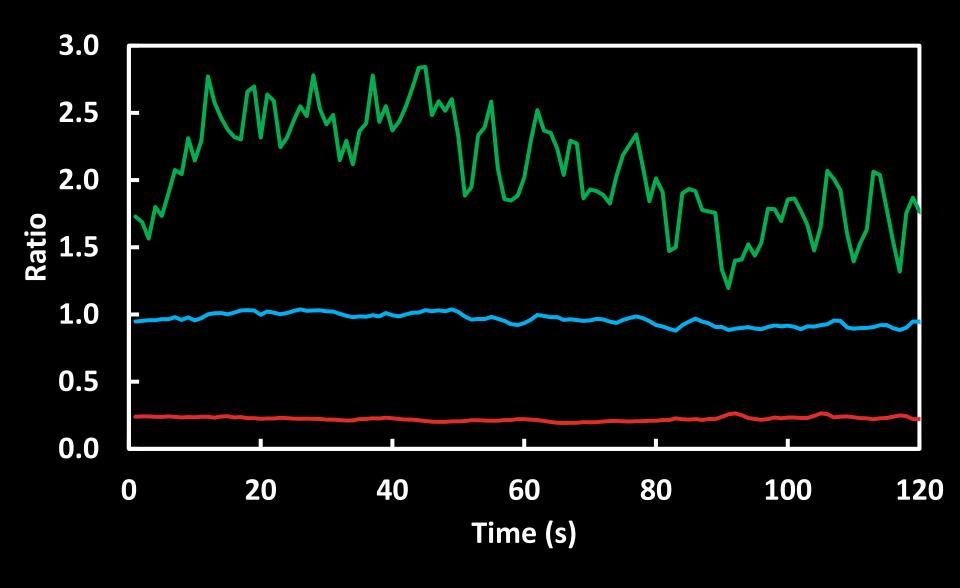
• Analyze > Analyze Particles

$$N_{erosions} = 4$$



−Edge Area / Centre Area **−−**Edge Mean / Centre Mean **−−**Edge Std Dev / Centre Std Dev

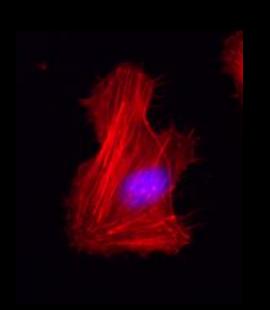
$$N_{erosions} = 2$$

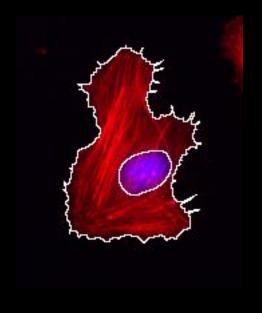


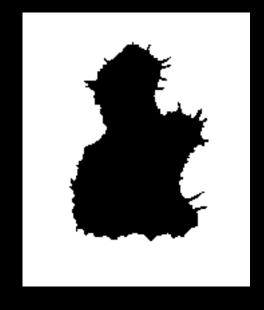
-Edge Area / Centre Area — Edge Mean / Centre Mean — Edge Std Dev / Centre Std Dev

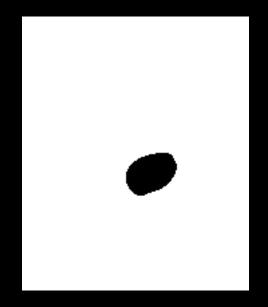
EASY TO EXTEND THIS APPROACH...

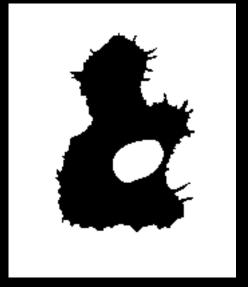
For example, to compare nuclear & non-nuclear expression





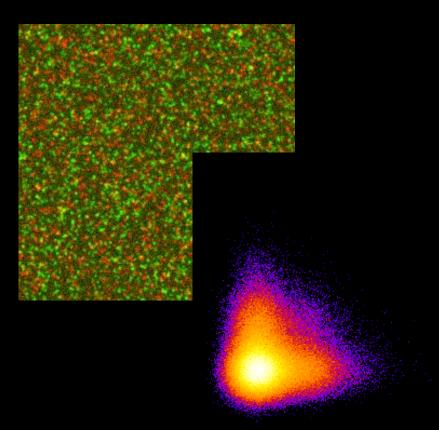






ADVANCED TOPICS

- Object Tracking
- Colocalisation analysis
- Writing macros & plugins





```
9 import ij.plugin.frame.RoiManager as RM
10 import fiji.plugin.kymographbuilder.KymographFactory as KFactory
13 def validDataset(dataset):
      """Assess if dataset has suitable dimensions"""
      from net.imagej.axis import Axes
      z = dataset.dimension(dataset.dimensionIndex(Axes.Z))
      t = dataset.dimension(dataset.dimensionIndex(Axes.TIME))
      return z * t > 1
21 rm = RM.getInstance()
23 if validDataset(dataset) and rm and rm.getCount():
       for roi in rm.getRoisAsArray():
          if roi.isLine():
               kfactory = KFactory(context, dataset, roi)
               kfactory.build()
               title = "Kymograph" + str(counter).zfill(3) + "_" + roi.getName()
               ij.ui().show(title, kfactory.getKymograph())
31
      log.info("MultiKymographBuilder Finished. " + str(counter) + " ROIs processed")
32 else:
      log.error("Either the ROI Manager is empty or " + dataset.getName() +" has invalid dimensions")
```

Bioinformatics Training

You are not currently logged in Log in

Map Map

Home

Your bookings

Timetable Courses Themes

Venues

Mon 26 Jun - Wed 28 Jun 2017

09:30, ...

Venue: Bioinformatics Training Room, Craik-Marshall Building,

Downing Site

Provided by: Bioinformatics

Booking

Bookings cannot be made on this event (Event is completed).

Other dates:

No more events

[Show past events]

Register interest

Register your interest - if you would be interested in additional dates being scheduled.

Image Analysis for Biologists

Description

This course will focus on computational methods for analysing cellular images and extracting quantitative data from them. The aim of this course is to familiarise the participants with computational image analysis methodologies, and to provide hands-on training in running quantitative analysis pipelines.

On day 1 we will introduce principles of image processing and analysis, giving an overview of commonly used algorithms through a series of talks and practicals based on Fiji, an extensible open source software package.

On day 2, we will describe the open Icy platform developed at the Institut Pasteur. Icy is a next-generation, user-friendly software offering powerful acquisition, visualisation, annotation and analysis algorithms for 5D bioimaging data, together with unique automation/scripting capabilities (notably via its graphical programming interface) and tight integration with existing software (e.g. ImageJ, Matlab, Micro-Manager).

On day 3, we will cover time series processing and cell tracking using TrackMate. In the afternoon, we will present the Image Data Resource, an added-value platform that combines data from multiple independent imaging experiments and imaging modalities and integrates them into a single resource for reanalysis in a convenient, scalable form.

Please note that if you are not eligible for a University of Cambridge Raven account you will need to book or register your interest by linking here.

Target audience

- Researchers who are applying or planning to apply image analysis in their research
- Graduate students, Postdocs and Staff members from the University of Cambridge, Affiliated Institutions and other external Institutions or individuals
- Please be aware that these courses are only free for University of Cambridge students. All other participants will be charged a registration fee in some form. Registration fees and further details regarding the charging policy are available here
- Further details regarding eligibility criteria are available here

Prerequisites

Basic skills in mathematics and programming are an advantage, but not a requirement.

Sessions

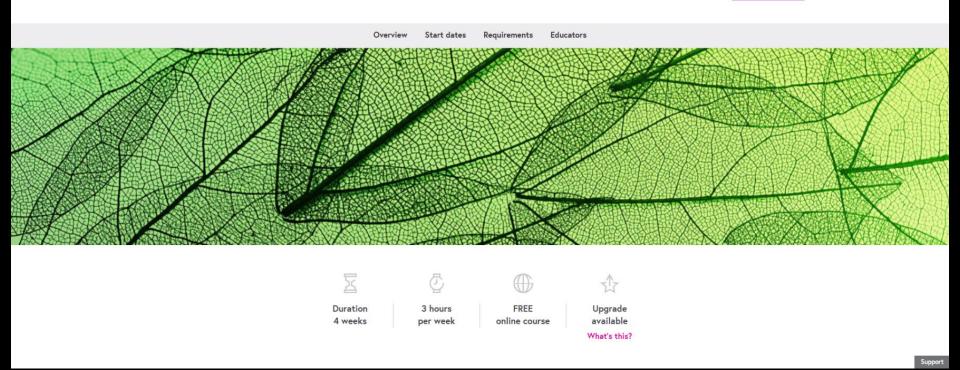
Number of sessions: 3





Get an introduction to image acquisition and analysis for biologists – from basic techniques to the future of image analysis.

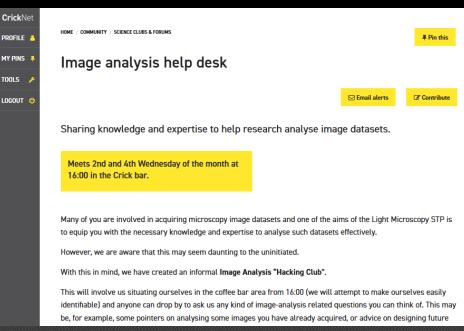


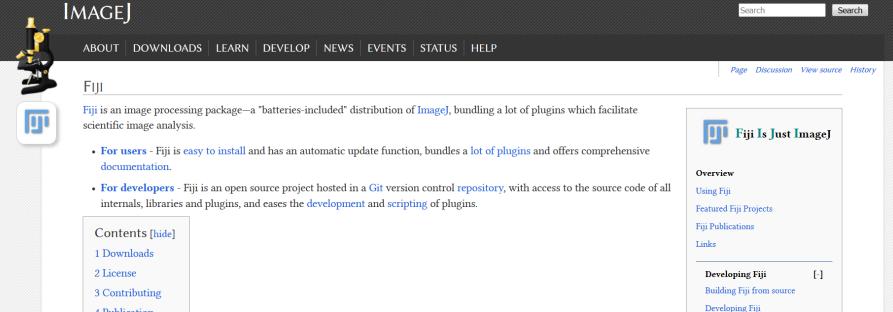


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4 Publication







Have a Nice Weekend

