

An introduction to image analysis using ImageJ

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“Raw Images, regardless of their aesthetics, are generally qualitative and therefore may have limited scientific use”.

“We may need to apply quantitative methods to extrapolate meaningful information from images”.

Examples of statistics that can be extracted from image sets

- **Intensities** (FRET, channel intensity ratios, target expression levels, phosphorylation etc).
- **Object counts** e.g. Number of cells or intracellular foci in an image.
- **Branch counts and orientations** in branching structures.
- **Polarisations and directionality**
- **Colocalisation of markers between channels** that may be suggestive of structure or multiple target interactions.
- **Object Clustering**
- **Object Tracking** in live imaging data.

Regardless of the image analysis software package or code that you use.....

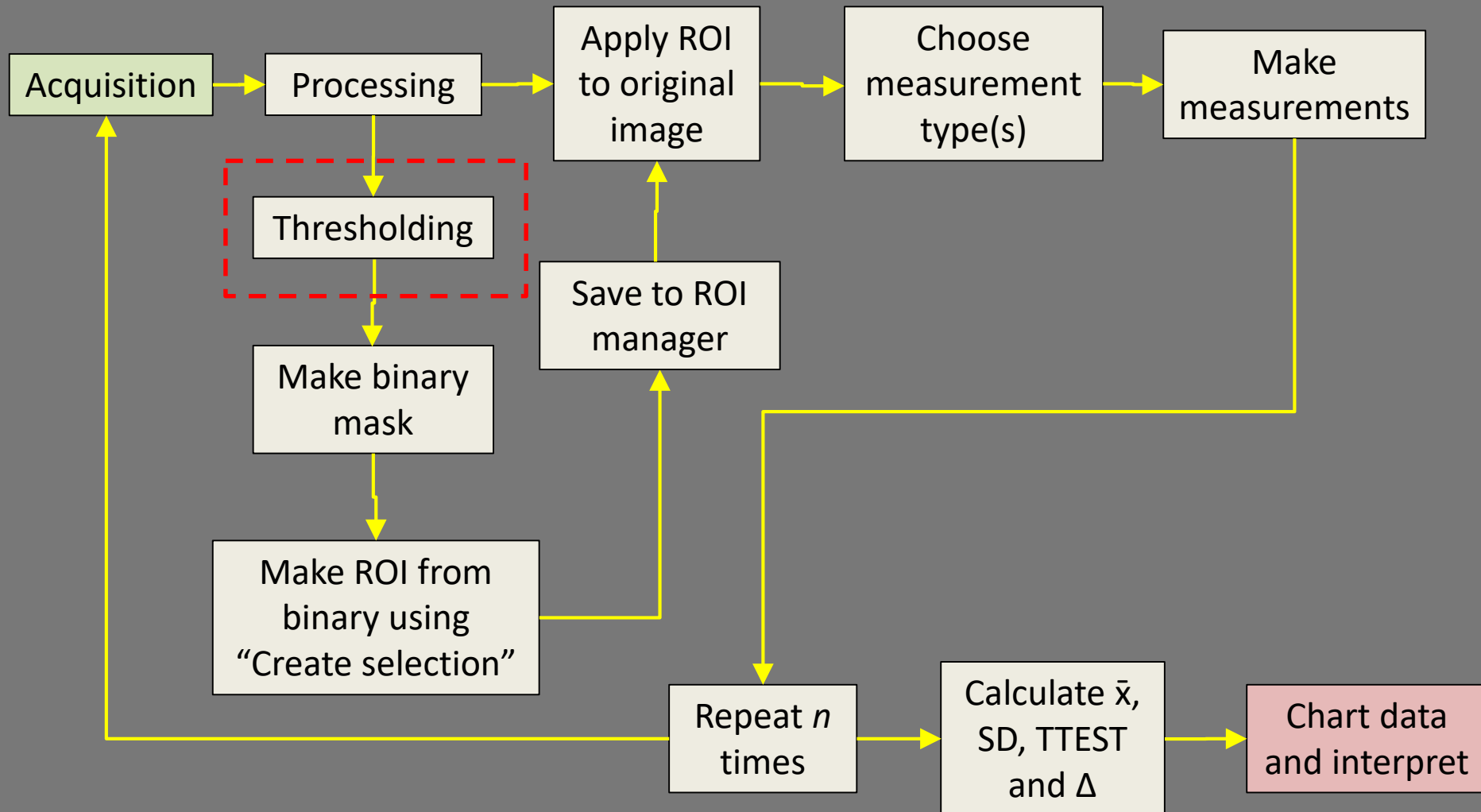
- ImageJ, Fiji, Matlab, Volocity and IMARIS apps.
- Java and Python coding languages.

....image analysis comprises of a workflow of predefined functions

which can be native, user programmed, downloaded as plugins or even used between apps.

This is much like a flow diagram or computer code.

Here's one example of an image analysis workflow:



**A few example Functions that can inserted into an image analysis workflow.
You can mix and match them to achieve the analysis that you want.**

****If there is an ROI present on the image, Fiji will only execute the function on the part of the image inside the ROI****

- **Automatic object detection**
- **Binarisation**
- **Image intensity Thresholding**
- **Mask generation**
- **Automatic generation of ROIs**
- **Skeletonization**
- **Vectorisation**
- **Object tracking**
- **Various colocalisation algorithms**
- **“Image math”**

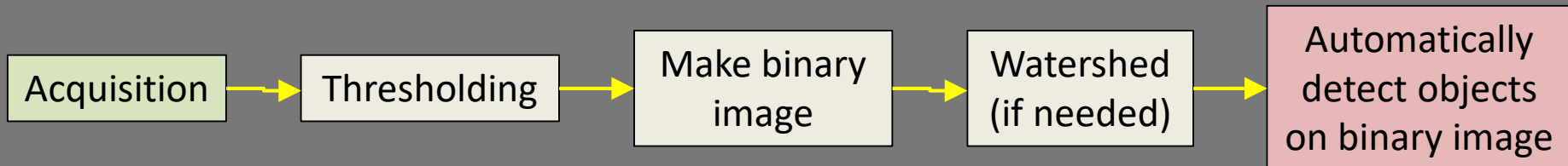
Particle selection

If you had multiple objects (cells, particles, nuclei etc) you could count them manually, but you can use imageJ/Fiji to do it for you and create masks and ROIs for measurement too.

This function enables the automatic detection of multiple objects in the image.

However, it needs the application of some other functions first. We need a binary (black and white only) image to help the particle analysis function detect the objects.

To tell Fiji which pixel grey values to make white and which ones black on the binary image, we need to threshold the image. Values above and below the selected threshold will be sent to either black or white.

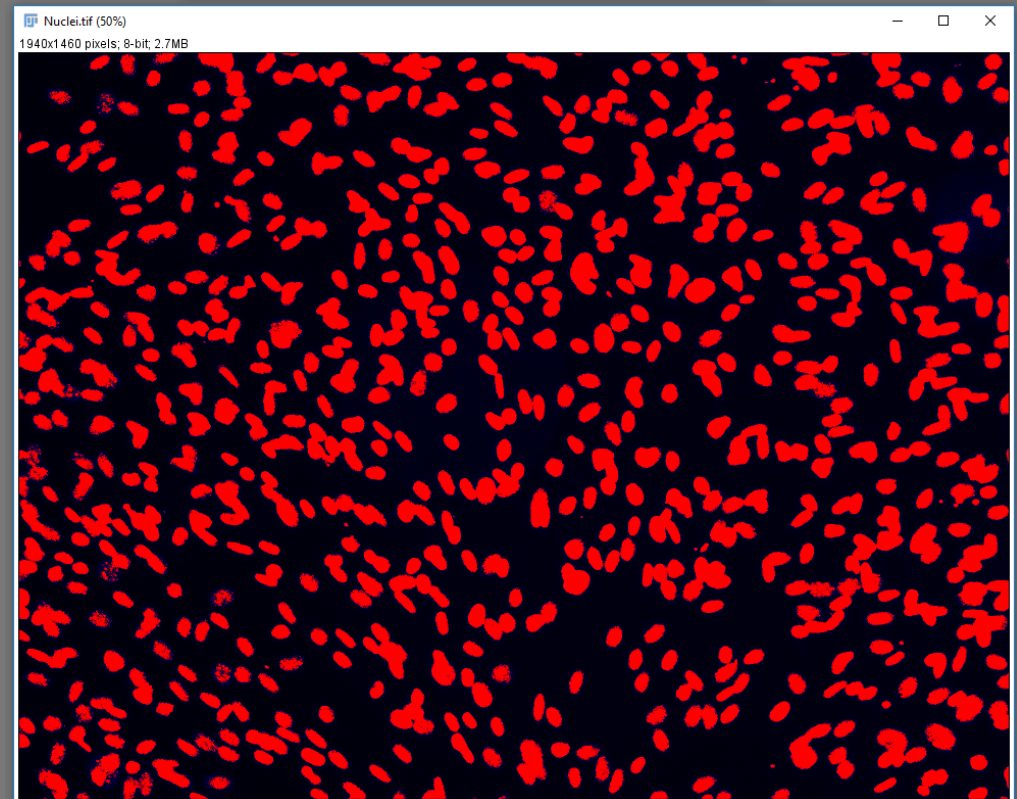
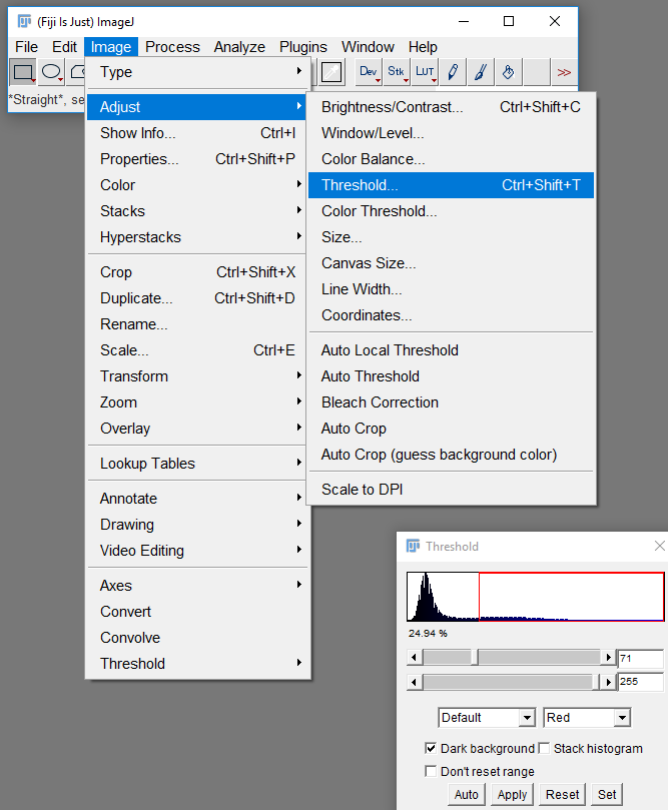


Particle selection

Open image “Nuclei”.

Select **Image>Adjust>Threshold**.

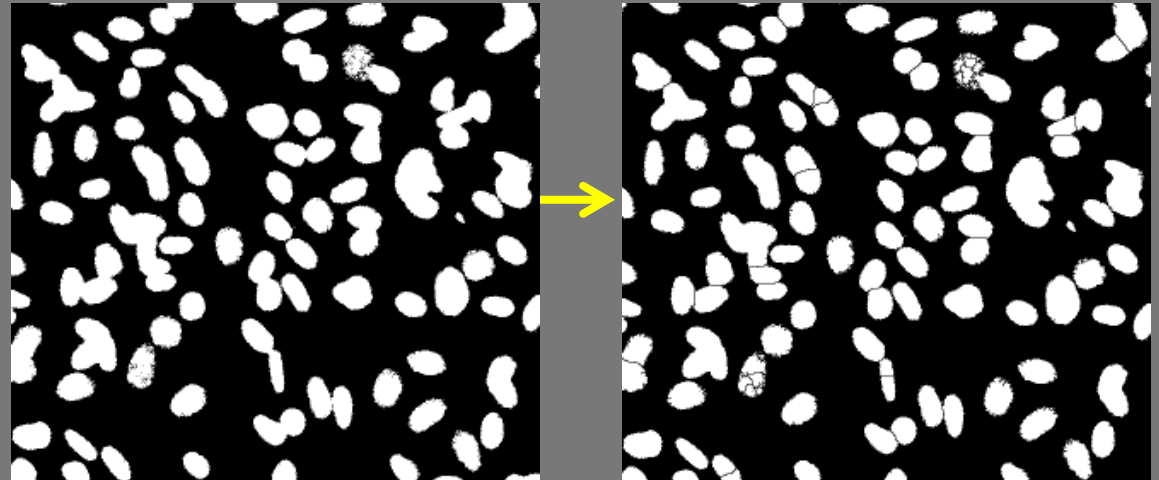
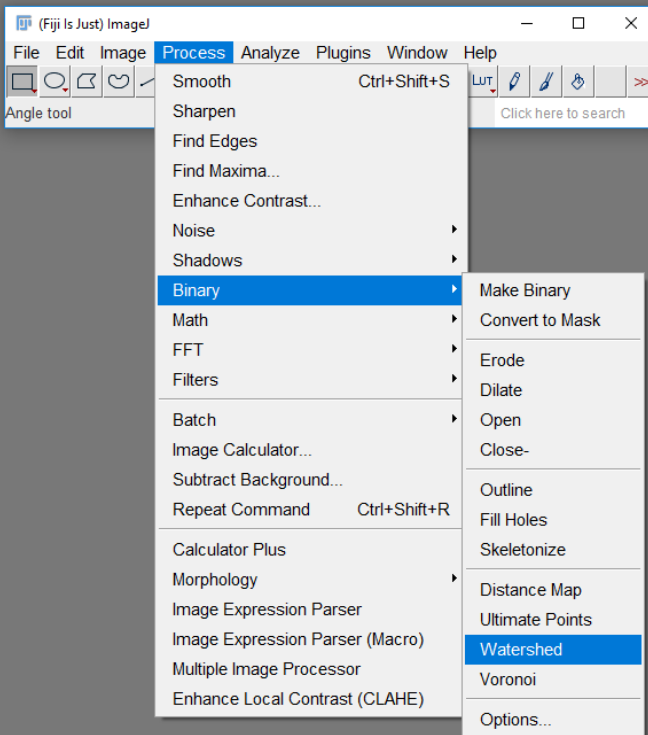
Tick “**Dark background**” and select “**Default**” and **Red**” from the pulldown menus. Using the top slider, threshold image until the nuclei are red against a dark background, then click “**Apply**” and then **Process>binary>make binary** to convert to a binary image.



Particle selection

Select **Process>Binary>Watershed**.

This function attempts to separate objects based on their circularity.



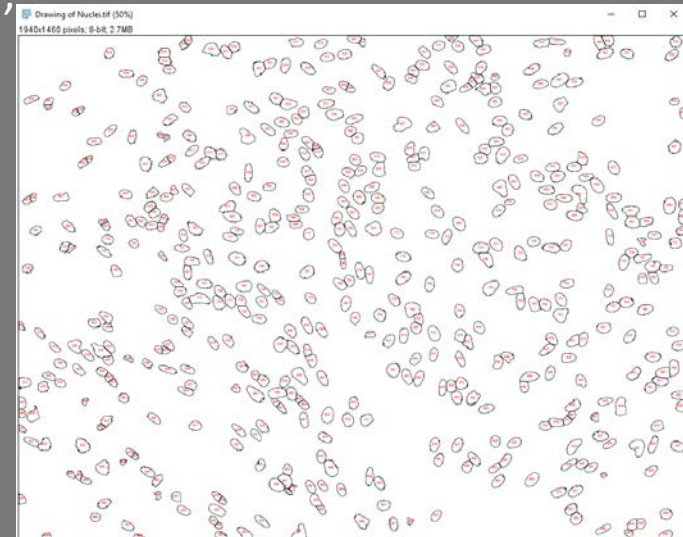
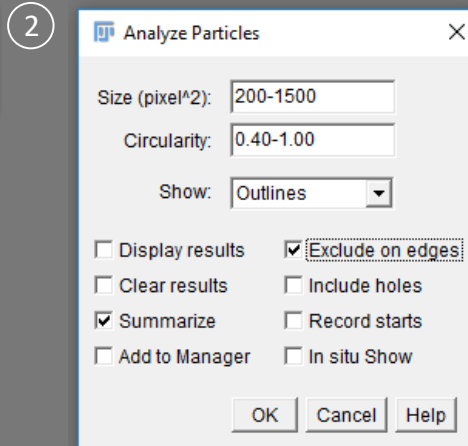
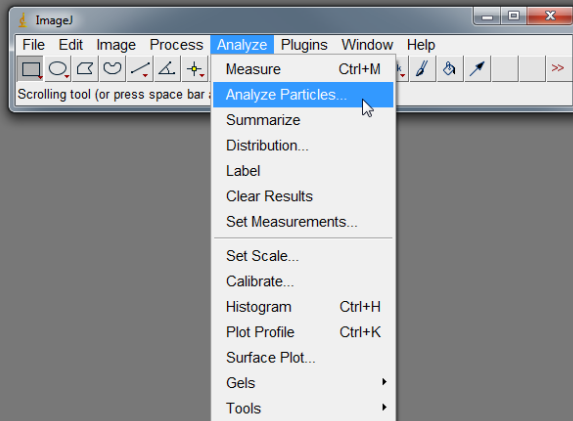
Particle selection

(3) Set the particle size and circularity discrimination and do the analysis

① Select **Analyze>Analyze Particles...**

② Adjust Size to 200-1500 and Circularity discrimination to 0.40 - 1.00 and select “**Show: Outlines**”. *Particles that are larger or less circular will be excluded*

③ Tick “**Summarize**” and “**Exclude on edges**” and click “**OK**”,
A results box should appear with a particle count and other information.



Summary

Slice	Count	Total Area	Average Size	%Area	Mean
Nuclei.tif	503	397315	789.891	14.026	255

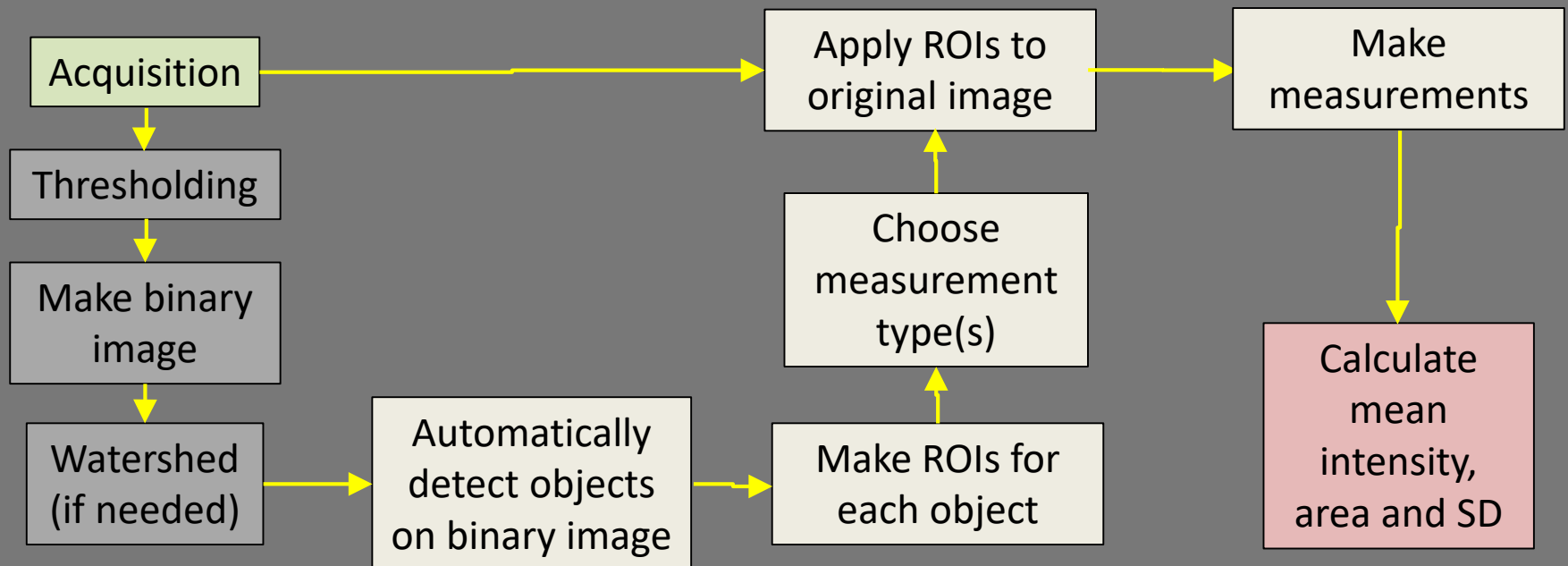
Keep the binary of the nuclei – you need it for the next bit!

Particle analysis – Area and Intensity

Now you know how to select particles, lets use the workflow to do an actual analysis.

This time we will use the binary image to make a separate ROI for each nucleus and then measure the area and mean intensity of each one.

Then we'll calculate mean and SD for both measurements for the whole population.



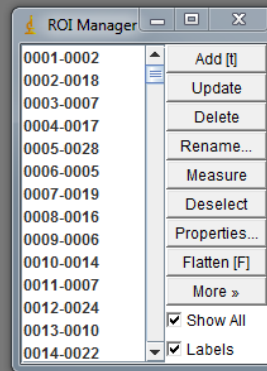
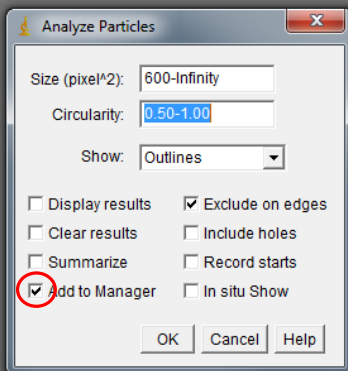
Particle analysis – Area and Intensity

- 1 Select the watershed binary image and select **Analyze>Measure>Analyze Particles** again. Repeat the particle analysis step tick “Add to manager”. Click “OK”.

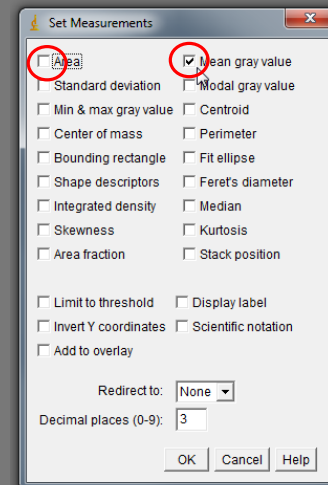
The ROI manager should pop up with a list of separate ROIs (one for each nucleus), which will also be displayed as an overlay on the watershed binary image.

- 2 Select **Analyze>Set Measurements**. And select which measurements you want to make, for example tick “Area” and “Mean gray value”.

1

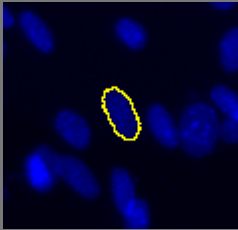


2

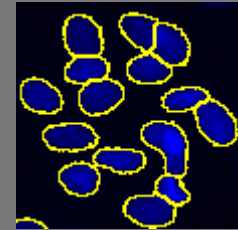


Particle analysis – Area and Intensity

Open the original unthresholded image “Nuclei” again. Individual nuclei can be selected and measured using the ROI manager (you can click the top one and scroll through with the mouse wheel). Select “Measure” or “Ctrl + M” to make individual measurements.



tick “Show all” to display all of the particles in the analysis



Make multiple selections by holding down [Ctrl] and Left-clicking.

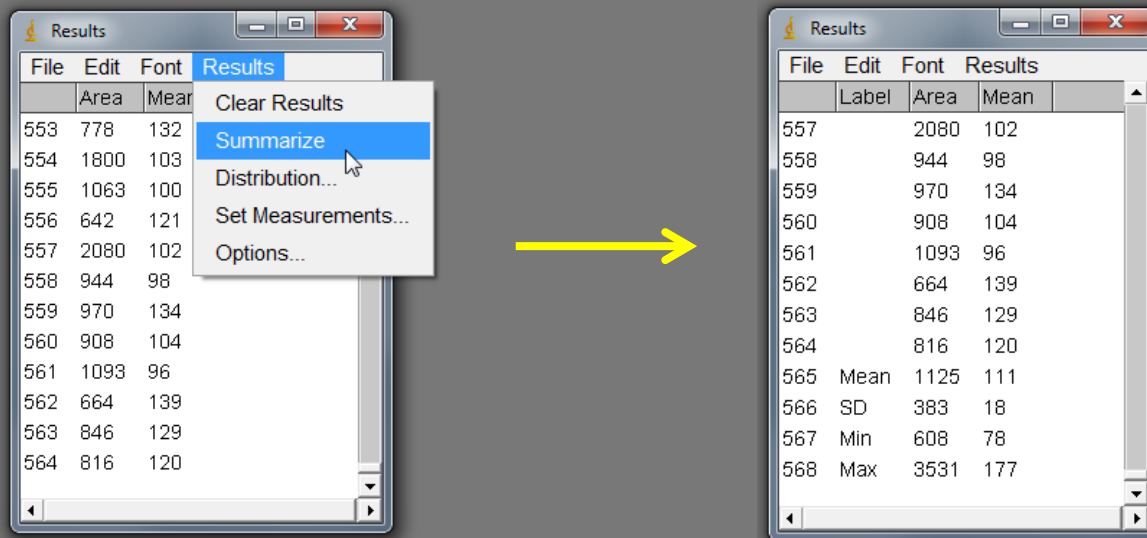
Scroll to the first ROI in the ROI manager. Hold down [shift] and Left click. Scroll to the last ROI. Hold down [shift] and Left click again to select all of the ROIs.

Select “Measure”.

Particle analysis – Area and Intensity

In the results window, select **Results>Summarize** to get mean and standard deviation data.

Data can be copied and pasted into Excel for further analysis.



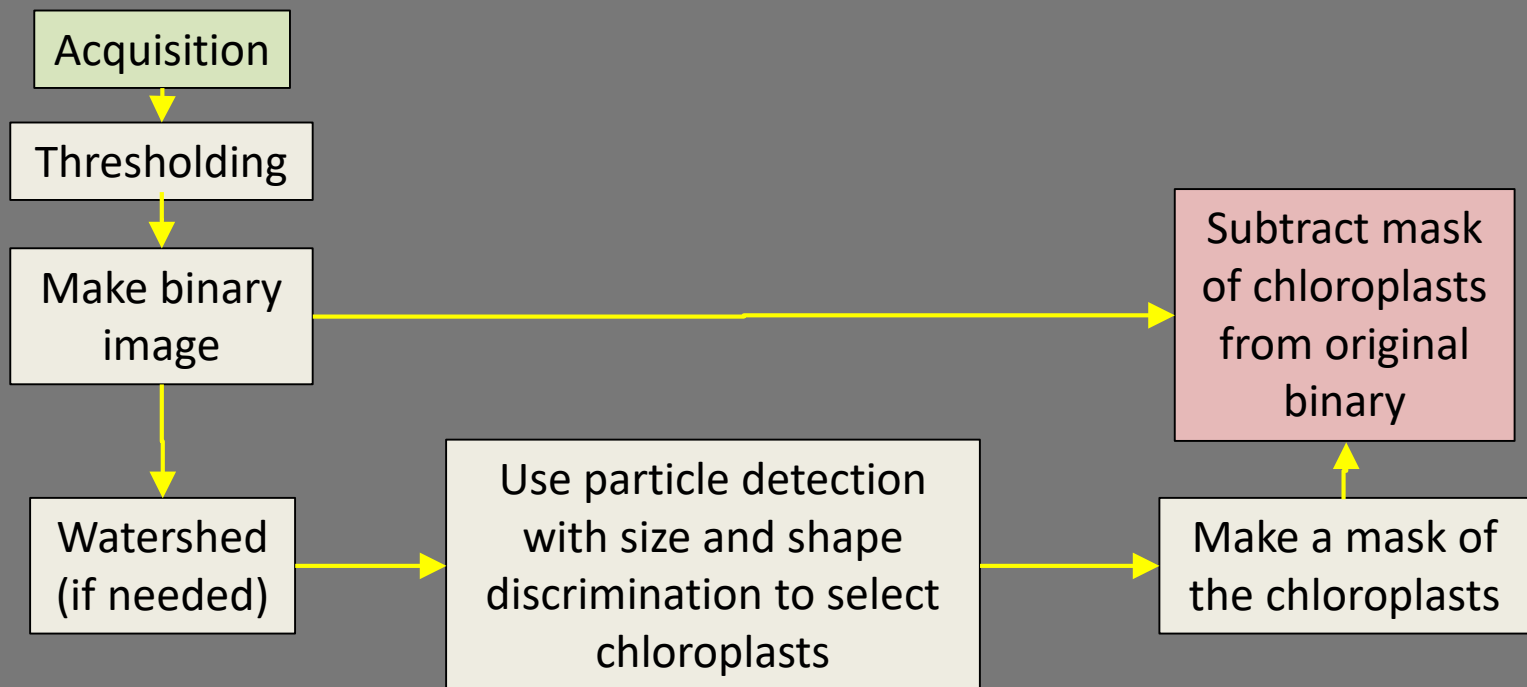
↑ ↑ ↑ Mean grey value of particle
Area of particle
Particle number

If image is not calibrated, measurement results will be displayed in pixel units.

Segmentation

We can use segmentation to separate a single image into separate components based on shape, size or intensity to make image analysis of each of those components possible.

For this we use “masks”. Masks are just a binary image being used for “Image calculation” (e.g. digital subtraction) to extract or remove specific structures. In this example we’ll use a particle analysis to make the masks and remove the chloroplasts from an image of a plant section.

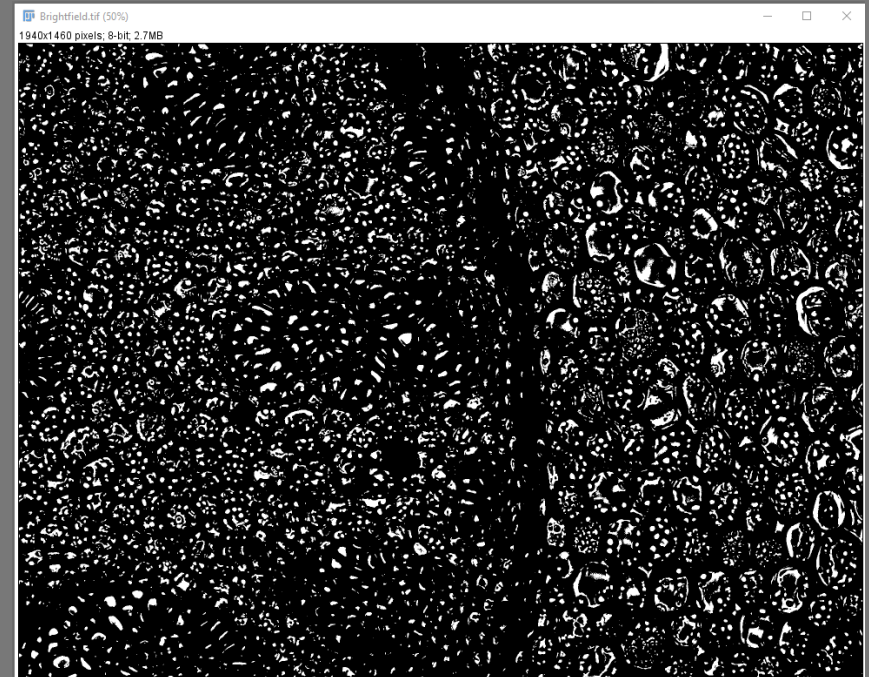
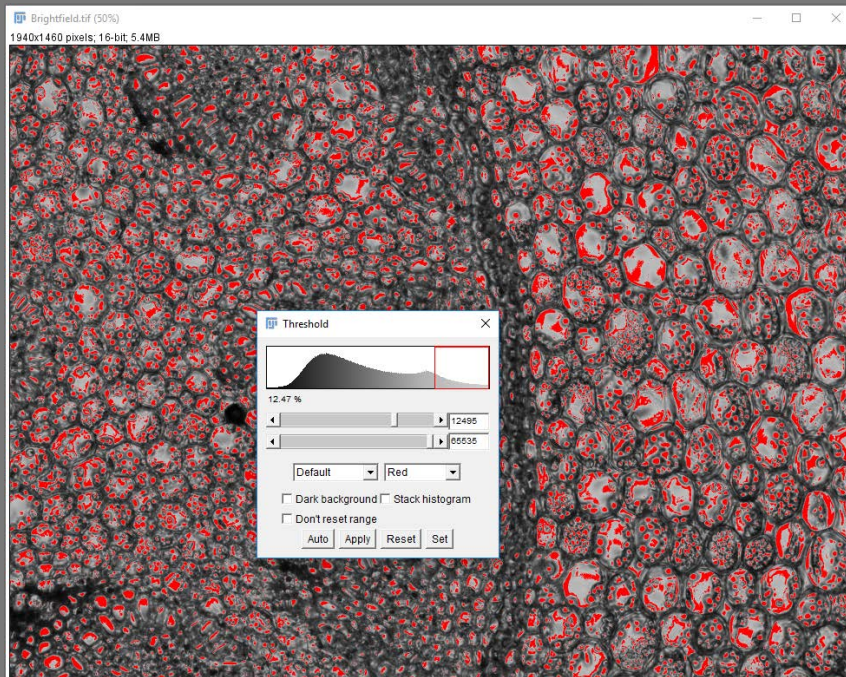


Segmentation

(1) Make a binary image to allow the software to identify the particles.

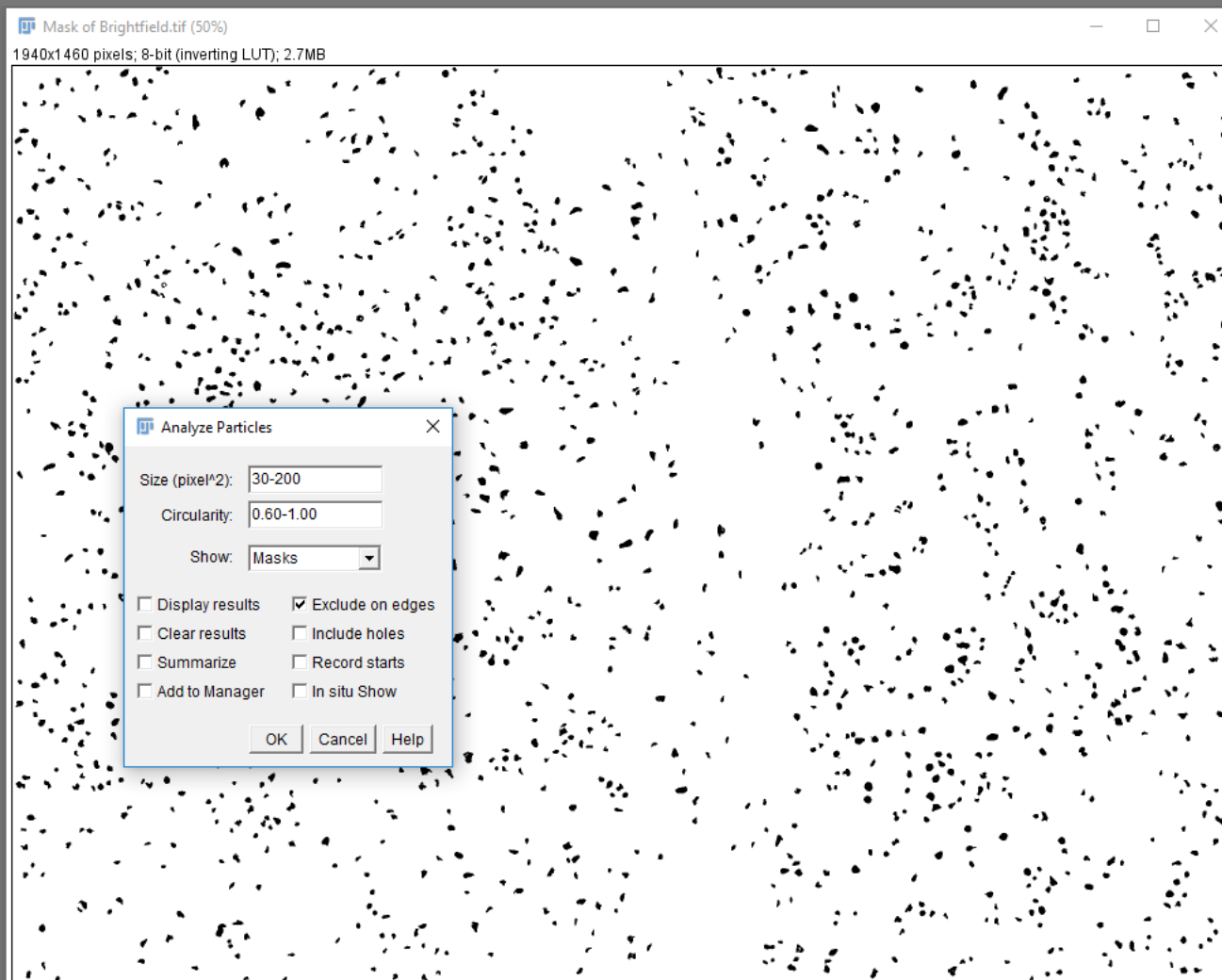
Open image “Brightfield” We just want to analyse chloroplasts (the small circular foci).
Untick “Dark background”, Select “Red” in the pull down menu

Image>Adjust>Threshold. Threshold using the “Minimum” (top) slider to find the range of image intensities that excludes the cell walls while preserving other structures (I chose 12495), they should turn red. and click “Apply”. Then “Process>Binary>Make binary”



Segmentation

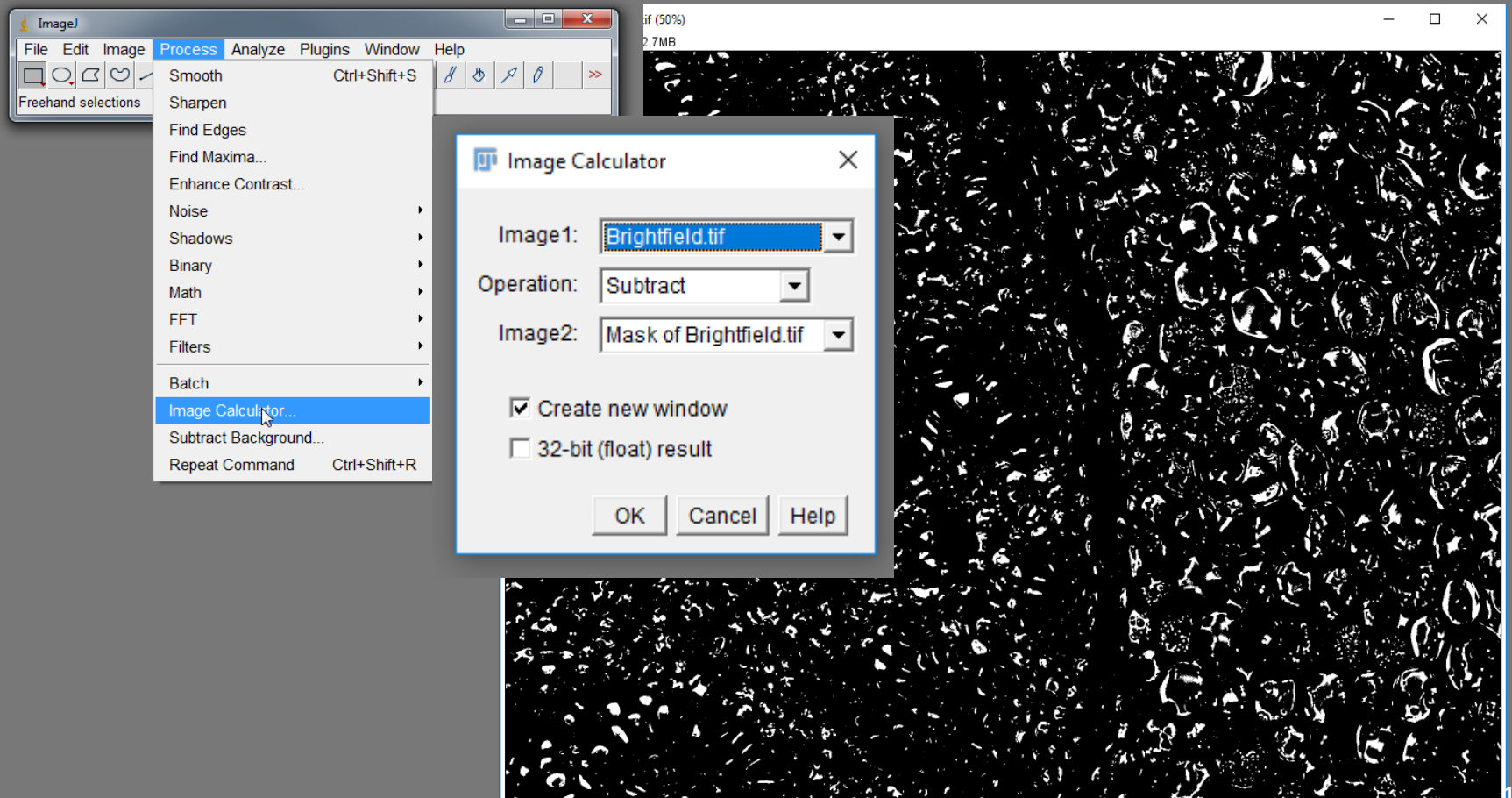
Analyze>Analyze Particles. Select “**Show: Masks**” and “**Exclude on edges**” Adjust the size (30-200) and circularity (0.6-1.00) discrimination of the particle analysis to select only the chloroplasts. Click “**OK**”. A binary image of the chloroplasts appears.



Segmentation

Select **Process>Image Calculator**. Select your original thresholded binary image as “image 1” and the binary mask of the chloroplasts as “image 2”.

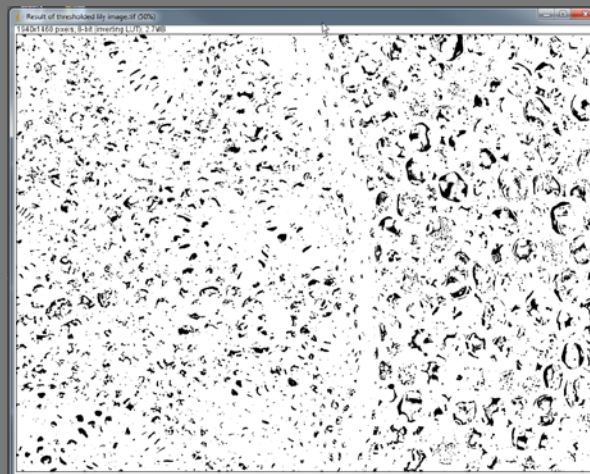
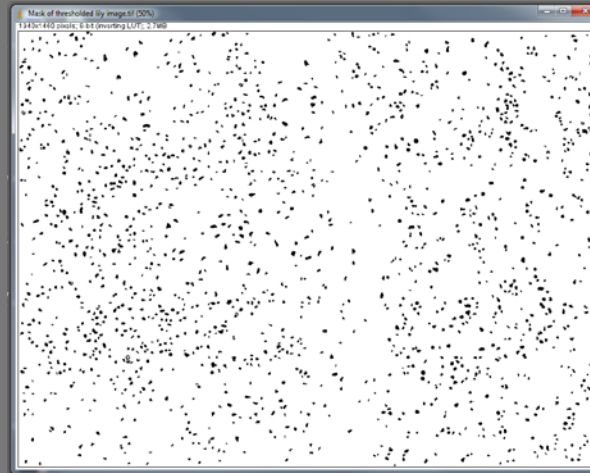
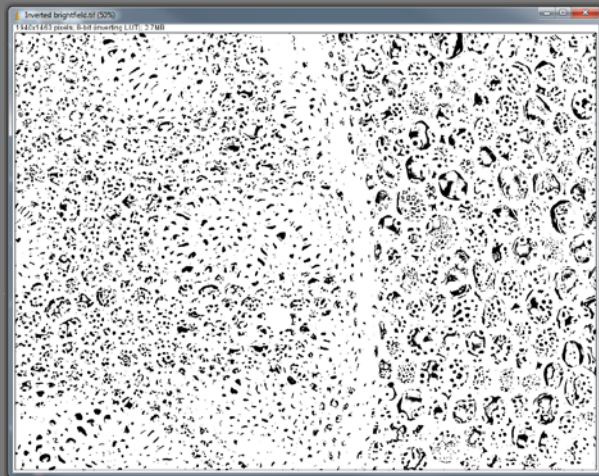
Select “**Subtract**”. A new image with the chloroplasts subtracted appears.



Segmentation

Images can now be used for analysis (e.g. particle count and area, create ROIs to analyse the original unthresholded images, as an image overlay or further segmentation).

Original binary



(I used Edit>Invert for clarity)

Binary of chloroplasts

- Particle analysis
- Overlay image
- Make into ROIs for further analysis
- Further segmentation

Binary with chloroplasts removed

- Overlay image
- Analyse stuff that isn't chloroplasts
- Further segmentation

Segmentation

Question:

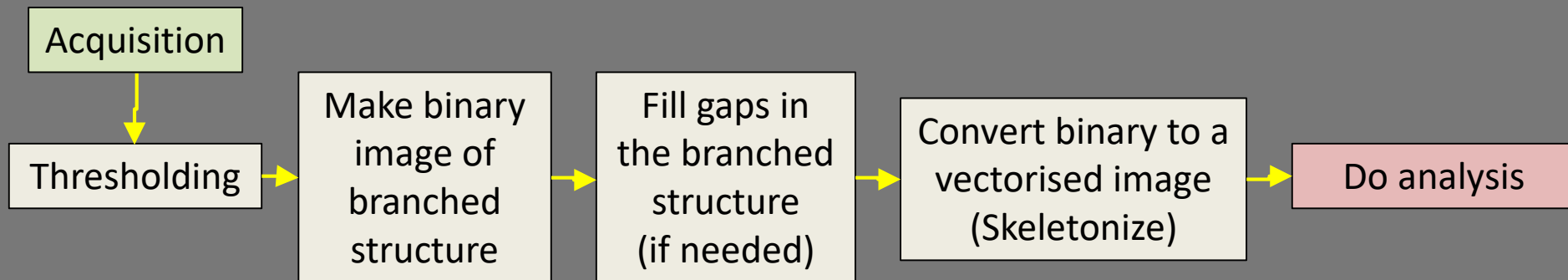
How could you create a grey scale image (rather than a binary) of the plant section without chloroplasts?

Analysing branched structures

We can analyse branched structures using “skeletonisation” of binary images

Branched structures could be neurons, blood vessels, lymph nodes or glands, root structures on plants or any other filamentous branching structure.

From these we might want to extract information as to the number or length of branches present, the number of branches per branch point, or the tortuosity of the structure (how “gnarly” it is).



Branch analysis

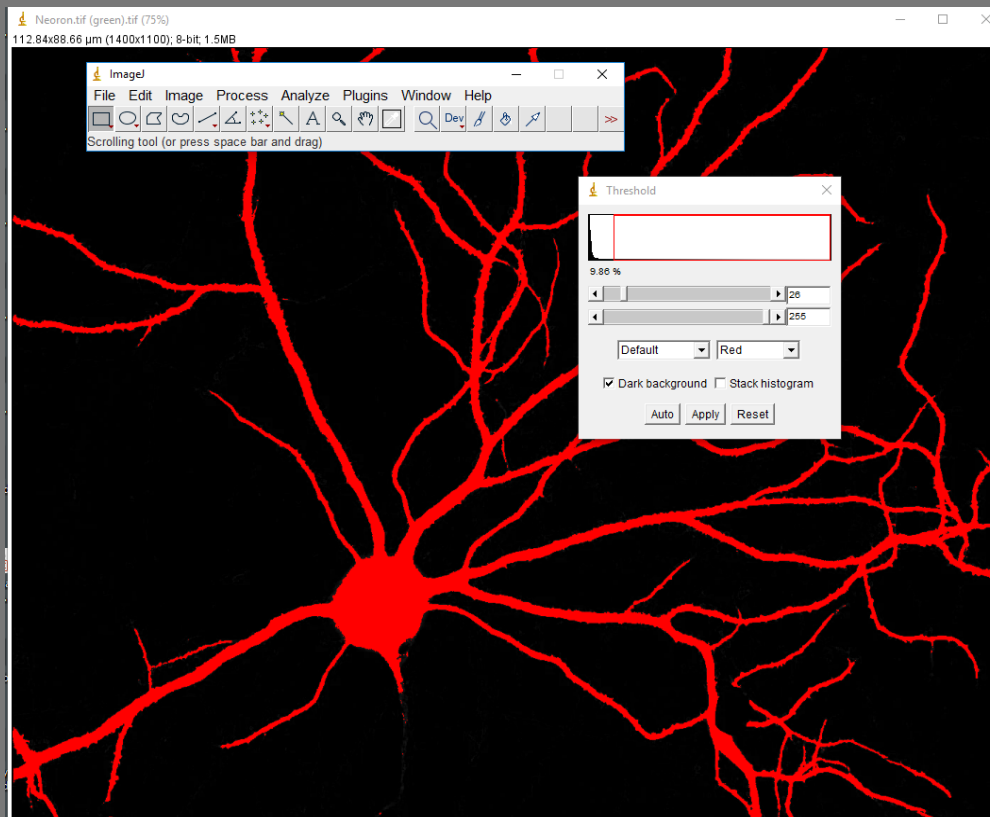
Open image: **Neuron (green).tif**

Threshold the image

Image>Adjust>Threshold. Choose “Default” and “Red” in the pulldown menus.

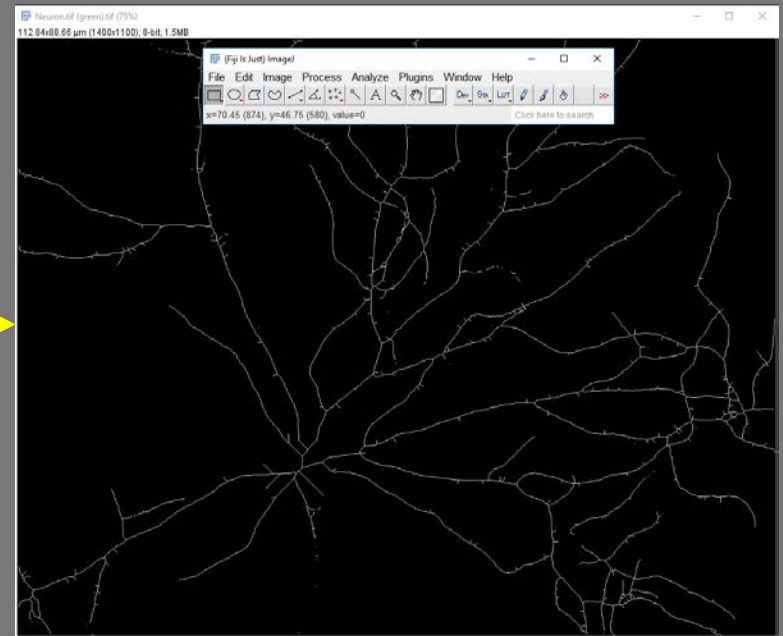
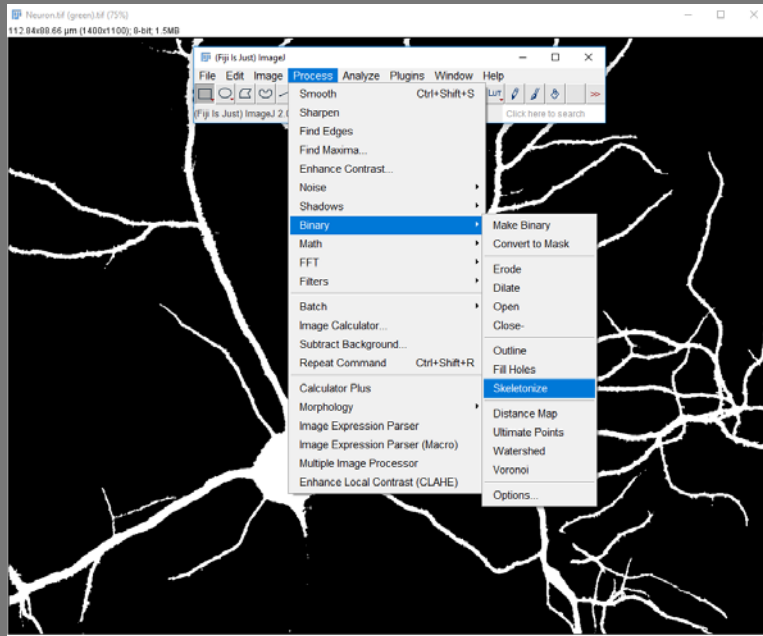
Tick “Dark Background”

To threshold the image, move the top slider until all of the foreground is red. Try to preserve the continuity of the axons as much as possible. When done click “Apply”.



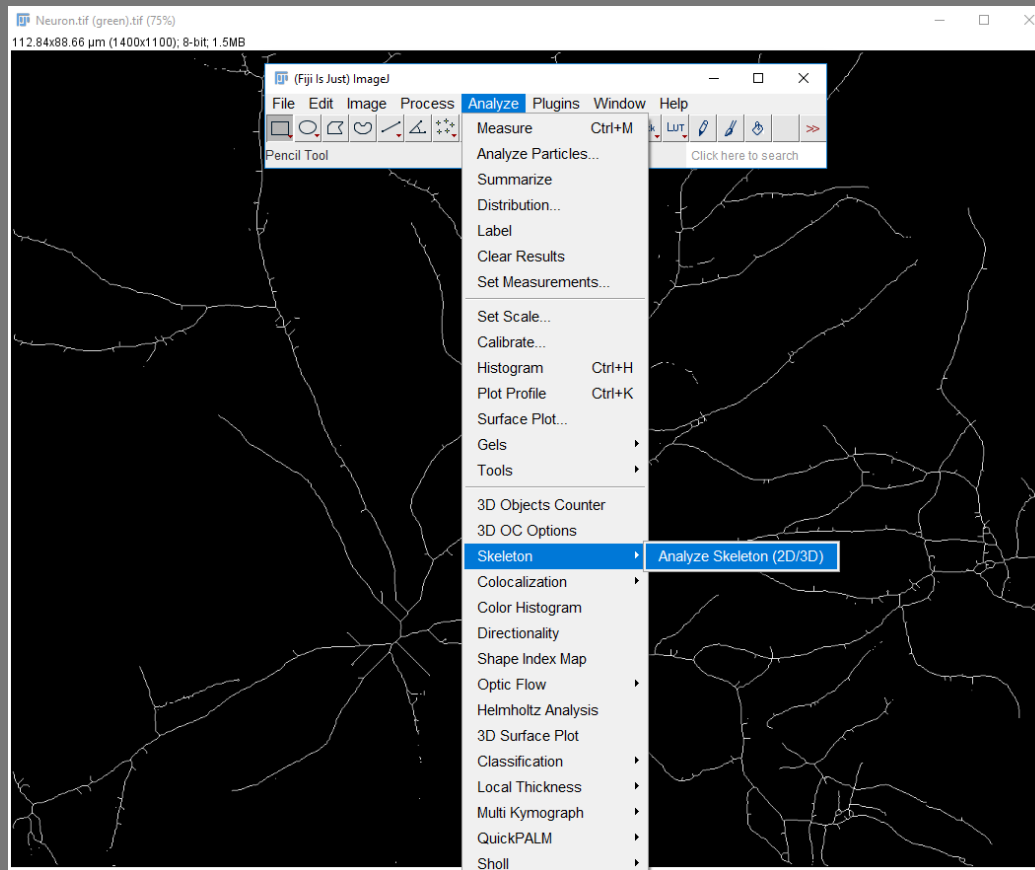
Skeletonise the binary image
Process>Binary>Skeletonize.

This converts the binary image to vectors – discrete lines with a known start and finish position.



Analyse the vectorised image

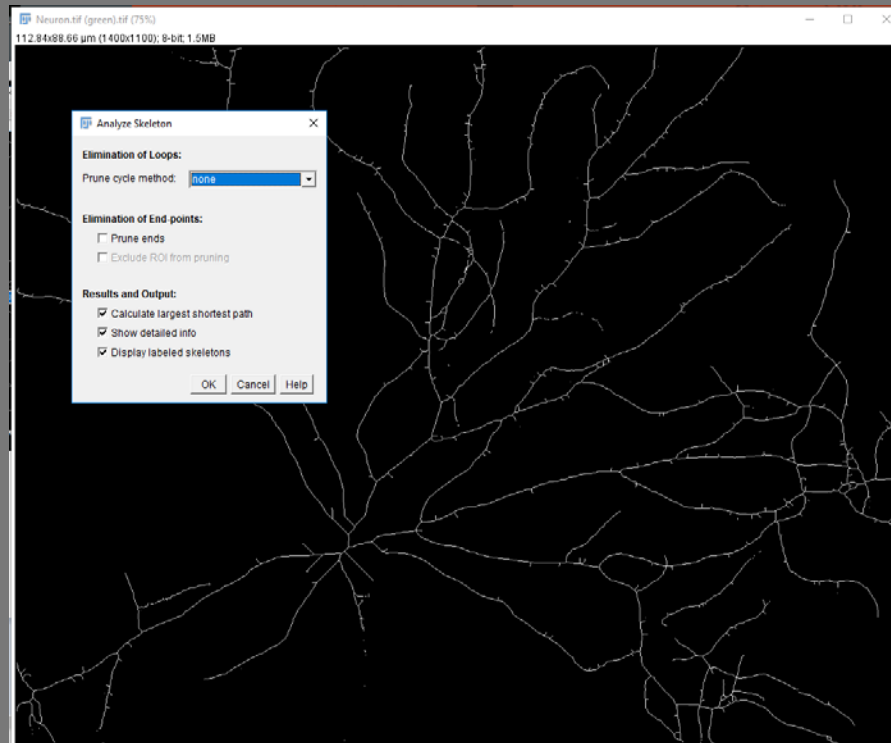
Analyse>Skeleton>Analyze Skeleton 2D/3D.



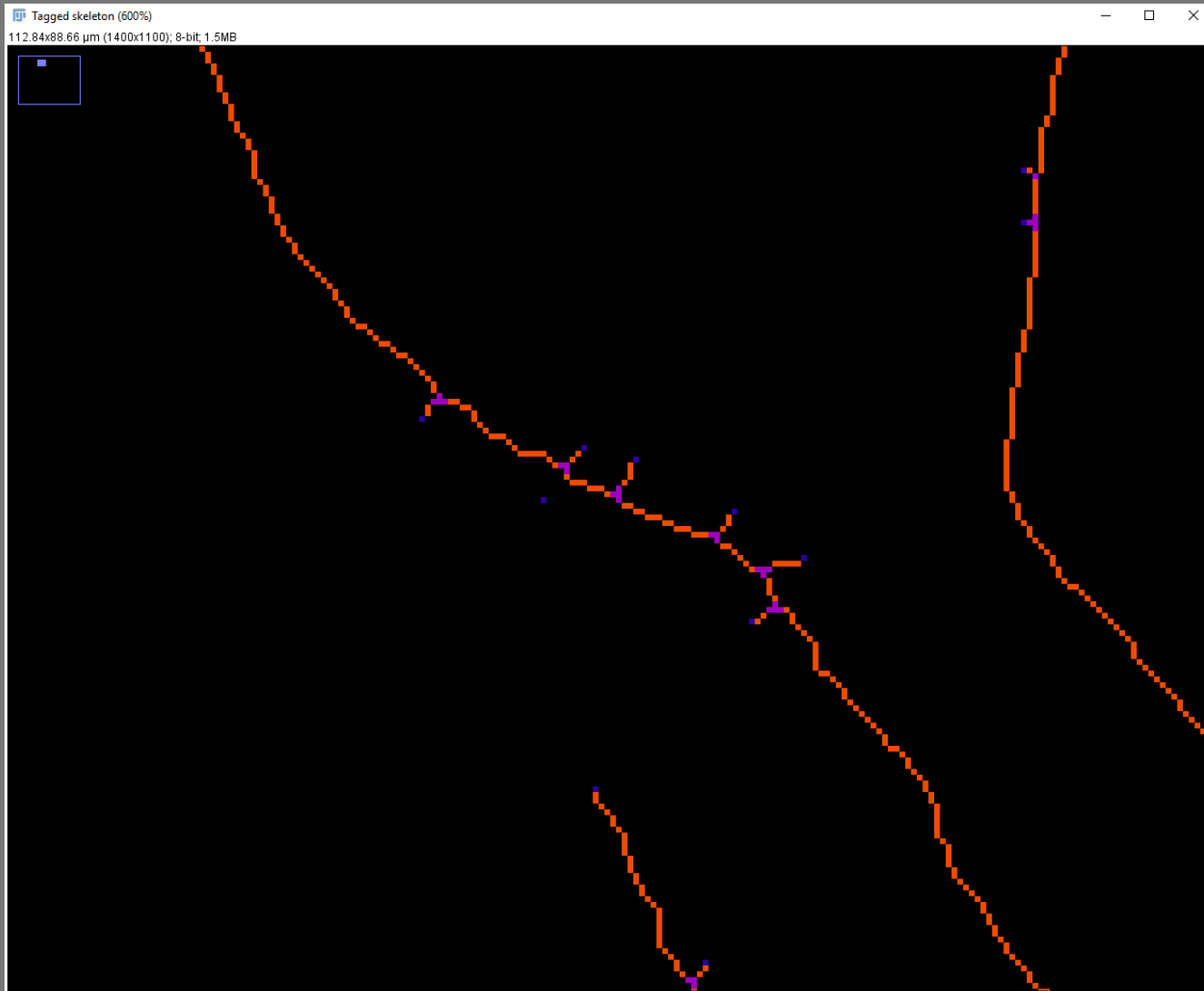
Tick:

Show detailed info and Display labelled skeletons

Select OK



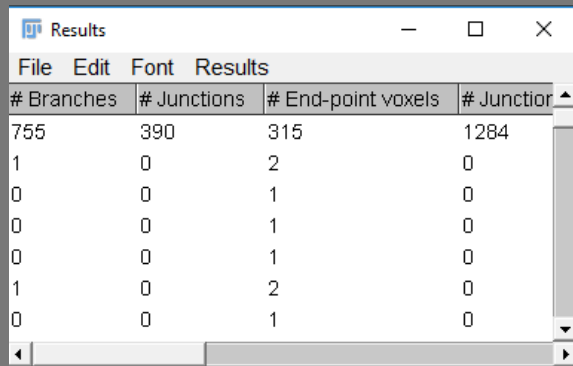
On the resulting image, branches are labelled in orange, junctions in magenta and end points in blue.



(Zoomed in with [Ctrl] + mouse wheel)

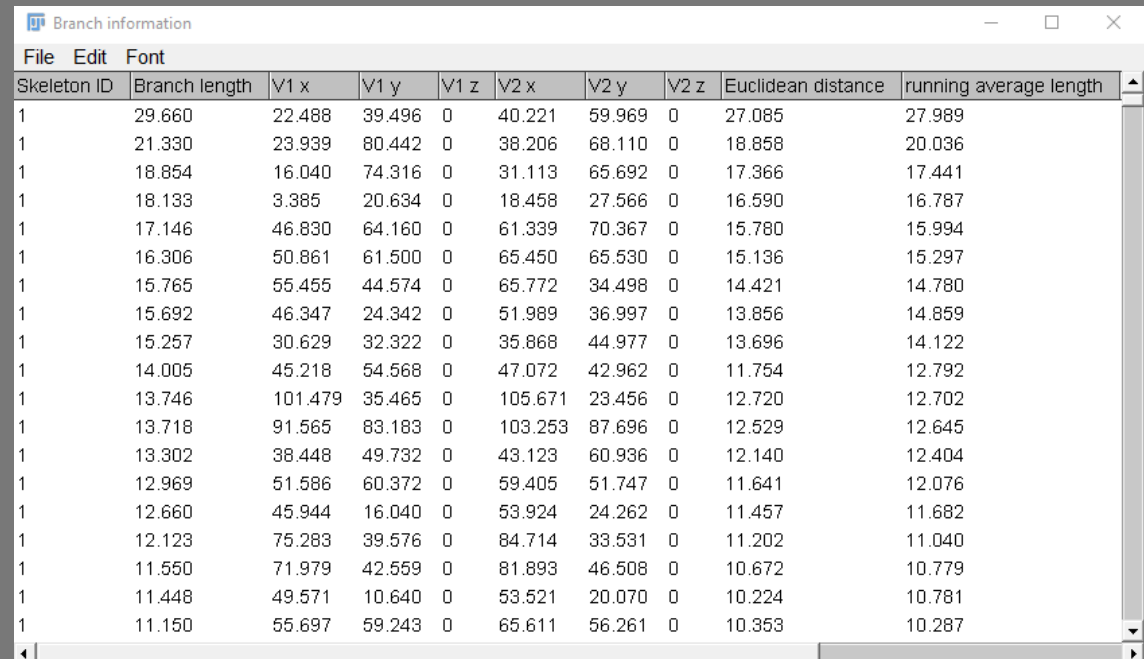
There are two results windows. One gives you general information about each complete skeleton in the image. E.g. how branched it is and how many double or triple junctions there are.

The other gives information about each branch in the skeleton. E.g. Branch length vs Euclidian distance will give you information about tortuosity. You could bin number of branches of each type depending on the branch length etc.



The 'Results' window displays a table with the following data:

# Branches	# Junctions	# End-point voxels	# Junction
755	390	315	1284
1	0	2	0
0	0	1	0
0	0	1	0
0	0	1	0
1	0	2	0
0	0	1	0



The 'Branch information' window displays a table with the following data:

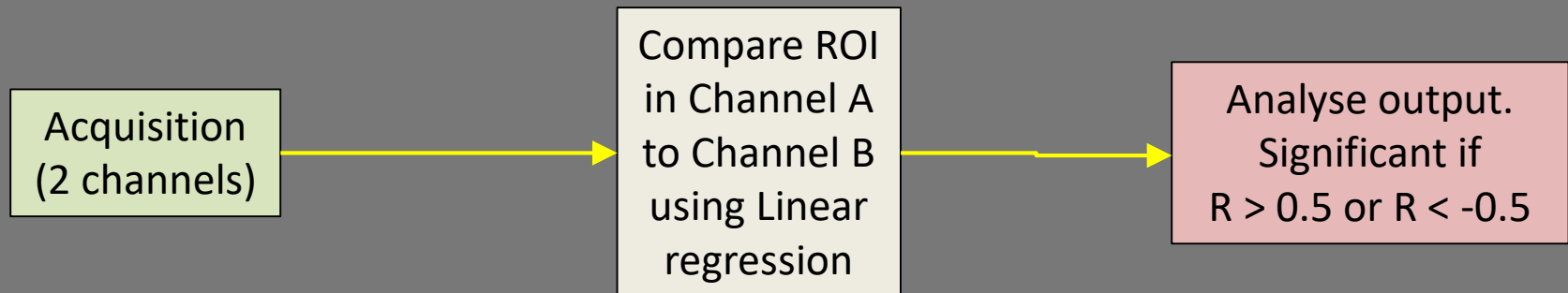
Skeleton ID	Branch length	V1 x	V1 y	V1 z	V2 x	V2 y	V2 z	Euclidean distance	running average length
1	29.660	22.488	39.496	0	40.221	59.969	0	27.085	27.989
1	21.330	23.939	80.442	0	38.206	68.110	0	18.858	20.036
1	18.854	16.040	74.316	0	31.113	65.692	0	17.366	17.441
1	18.133	3.385	20.634	0	18.458	27.566	0	16.590	16.787
1	17.146	46.830	64.160	0	61.339	70.367	0	15.780	15.994
1	16.306	50.861	61.500	0	65.450	65.530	0	15.136	15.297
1	15.765	55.455	44.574	0	65.772	34.498	0	14.421	14.780
1	15.692	46.347	24.342	0	51.989	36.997	0	13.856	14.859
1	15.257	30.629	32.322	0	35.868	44.977	0	13.696	14.122
1	14.005	45.218	54.568	0	47.072	42.962	0	11.754	12.792
1	13.746	101.479	35.465	0	105.671	23.456	0	12.720	12.702
1	13.718	91.565	83.183	0	103.253	87.696	0	12.529	12.645
1	13.302	38.448	49.732	0	43.123	60.936	0	12.140	12.404
1	12.969	51.586	60.372	0	59.405	51.747	0	11.641	12.076
1	12.660	45.944	16.040	0	53.924	24.262	0	11.457	11.682
1	12.123	75.283	39.576	0	84.714	33.531	0	11.202	11.040
1	11.550	71.979	42.559	0	81.893	46.508	0	10.672	10.779
1	11.448	49.571	10.640	0	53.521	20.070	0	10.224	10.781
1	11.150	55.697	59.243	0	65.611	56.261	0	10.353	10.287

Colocalisation analysis.

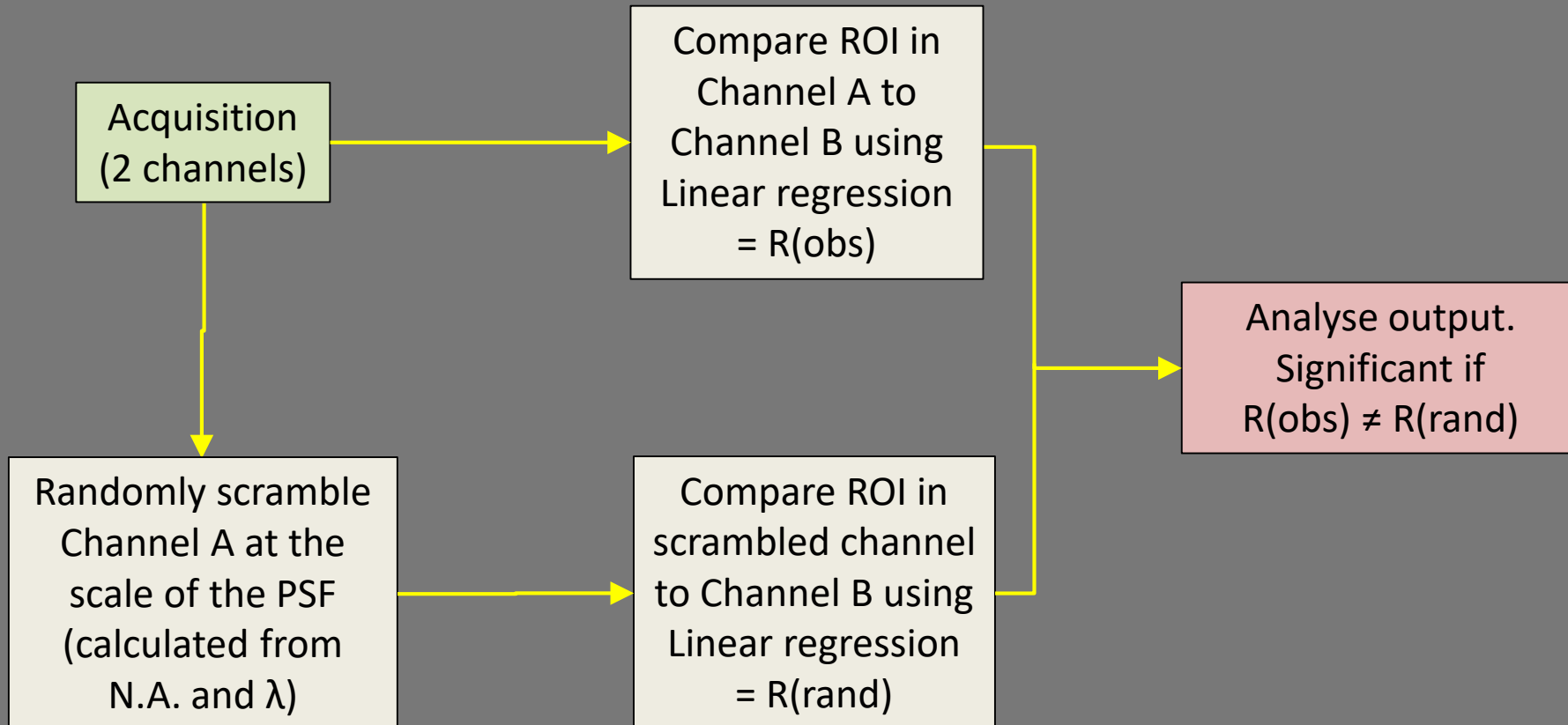
Colocalisation is a process where we attempt to quantify the relationship between markers from two different channels.

There are many methods, but they fall into two main categories – quantifying pixel overlap or quantifying co-dependency using regression. For this workshop we'll focus on the regression method, however here are some other workflows.

Simple Pearson's R analysis (Regression, background insensitive)

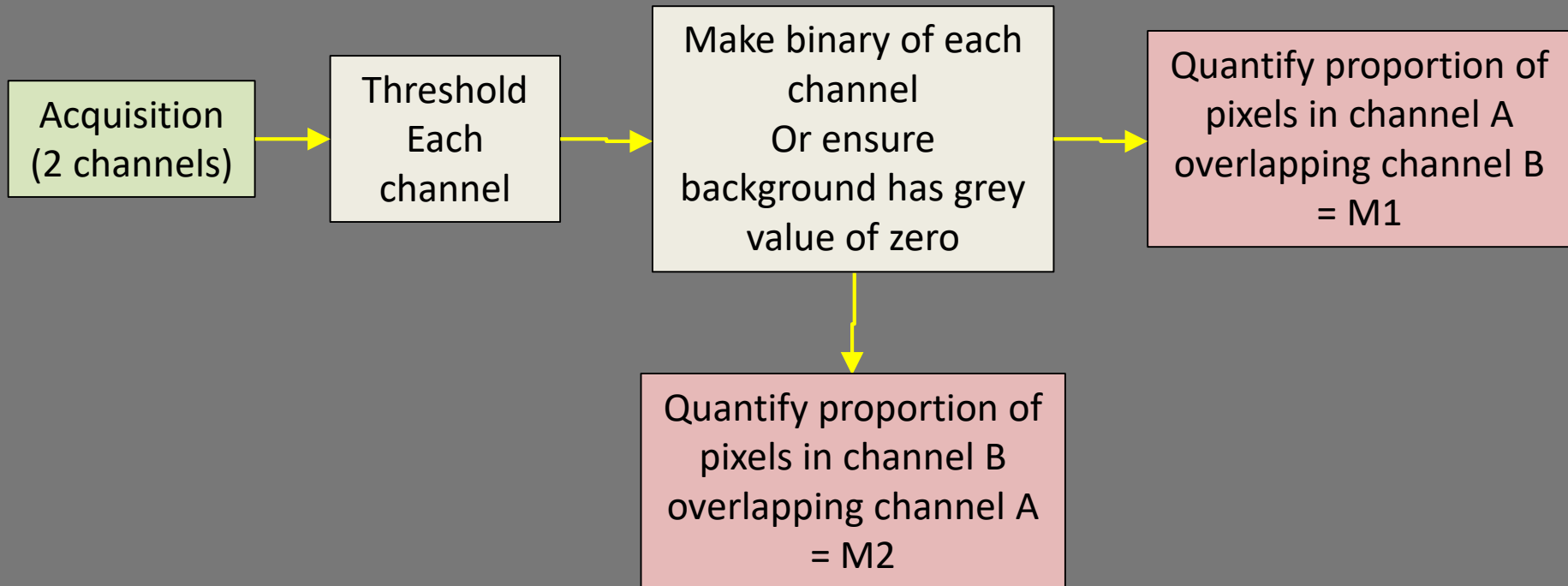


Costes' method (Regression, background insensitive)

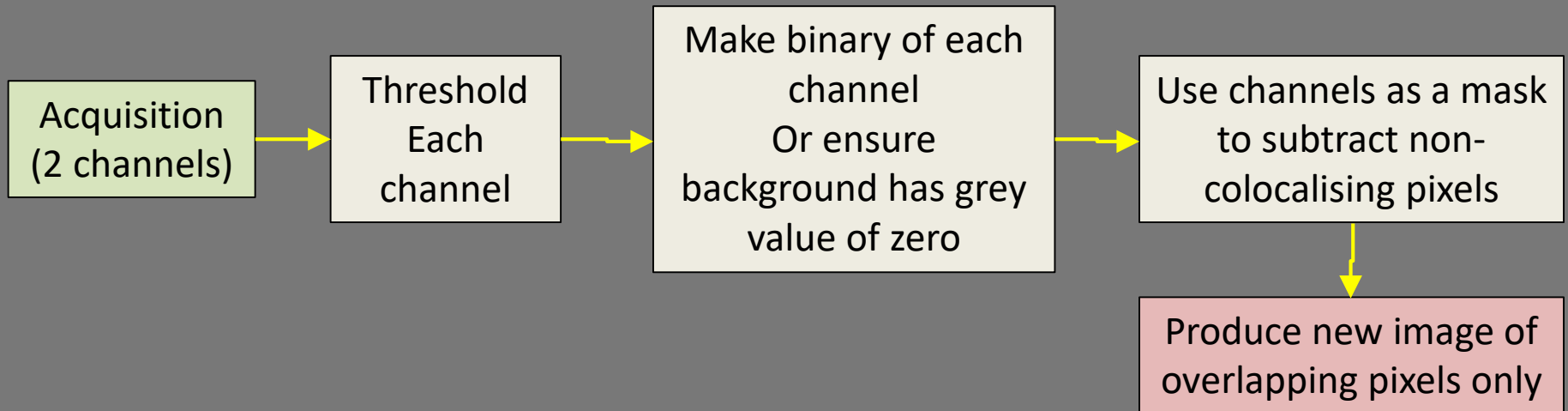


Manders Coefficients (Overlap, background Sensitive)

We may know that two targets colocalise from their Pearson's R, but we can also quantify how much of each target is colocalising with the other channel.



Digital subtraction (Overlap, background Sensitive, not quantitative)



Pearson's colocalisation analysis

Colocalisation analysis provides a statistically testable numerical value relative to the degree of colocalisation between two image channels.

Pearson's colocalisation coefficient uses linear regression to measure the co-dependency of the variations in grey intensity across two channel images and returns the value "R".

The value for R can range from -1 to +1 and can be interpreted as follows:

R = -1 The two stains are absolutely mutually exclusive

R = 0 No significant co-dependency between the two stains – random distribution

R = 1 The two stains are absolutely dependent (A value very close to 1 may indicate experimental error or channel cross-talk)

Pearson's colocalisation analysis

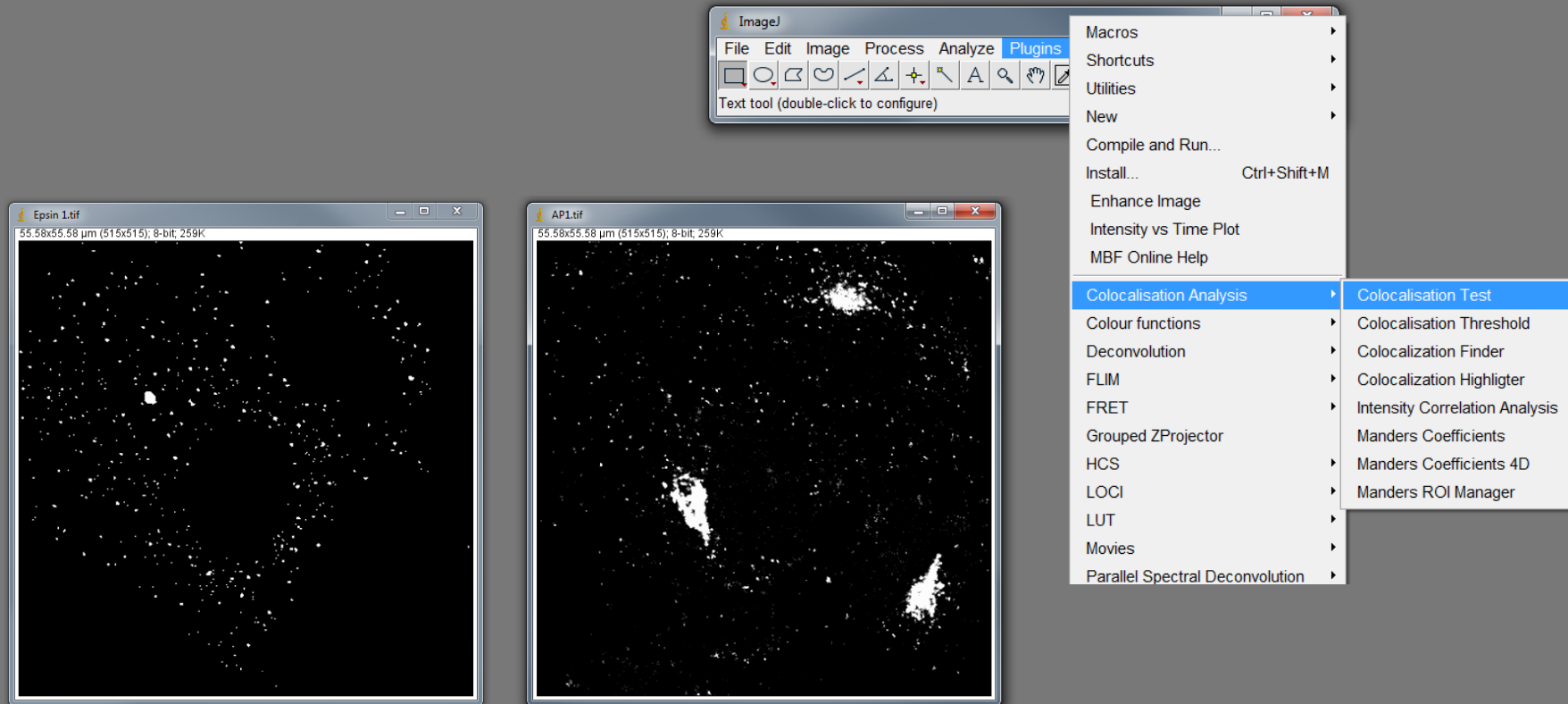
As R-values may be positive but still close to zero, a value closer to 0.5 (or above) is considered statistically significant. However, the significance of Pearson's R can be further tested using Costes' approximation:

- The channel images are analysed to return the observed Pearson's coefficient $R(\text{obs})$.
- One of the channel images is then randomised using a unit size determined by the optical resolution of the image determined by a PSF calculated from the N.A. of the objective lens used.
- The randomised image is then compared to the intact channel image using Pearson's colocalisation coefficient.
- This process is repeated 200 times to return $R(\text{rand})$ with an expected outcome close to zero, and a standard deviation is calculated.

Pearson's colocalisation analysis – worked example

Open channel images “Epsin 1.tif” and “AP1.tif”

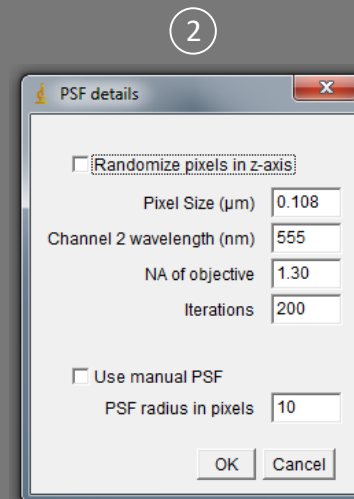
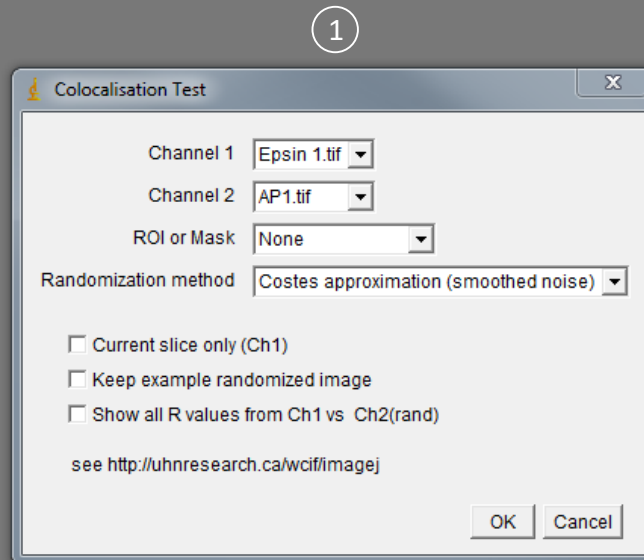
Select **Plugins>Colocalisation Analysis>Colocalisation Test**.



Pearson's colocalisation analysis – worked example

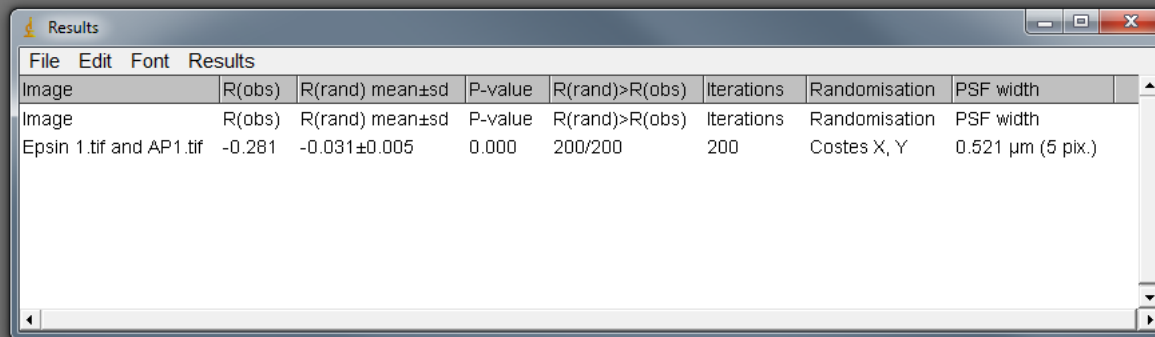
- ① Select **Epsin 1** as Channel 1 and **AP1** as Channel 2 and click “OK”
- ② Enter the channel 2 wavelength and the objective N.A. Iterations should be set to 200.

Click “OK”.



Pearson's colocalisation analysis – worked example

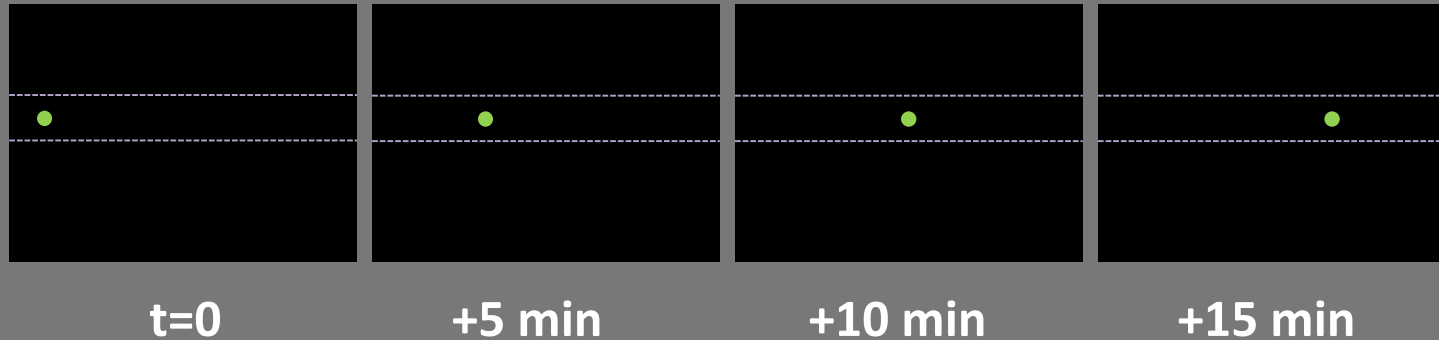
A results window pops up summarising the R(obs) and R(rand) for the two channels.



The screenshot shows a software window titled 'Results' with a menu bar (File, Edit, Font, Results) and a table of analysis results. The table has columns for Image, R(obs), R(rand) mean±sd, P-value, R(rand)>R(obs), Iterations, Randomisation, and PSF width. The data row shows results for 'Epsin 1.tif and AP1.tif' with R(obs) = -0.281, R(rand) mean±sd = -0.031±0.005, P-value = 0.000, R(rand)>R(obs) = 200/200, Iterations = 200, Randomisation = Costes X, Y, and PSF width = 0.521 µm (5 pix.).

Image	R(obs)	R(rand) mean±sd	P-value	R(rand)>R(obs)	Iterations	Randomisation	PSF width
Epsin 1.tif and AP1.tif	-0.281	-0.031±0.005	0.000	200/200	200	Costes X, Y	0.521 µm (5 pix.)

Manual tracking

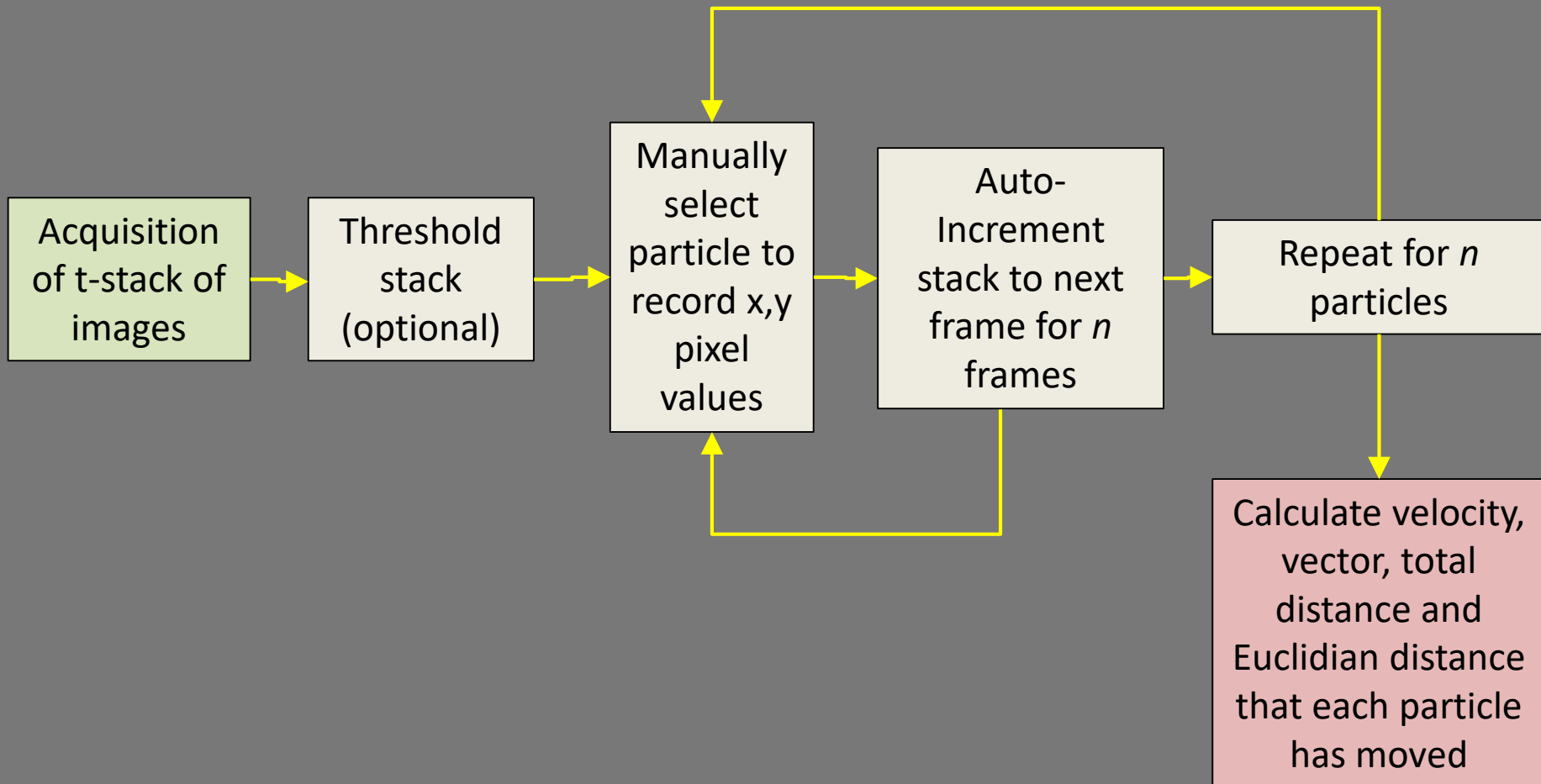


The microscope is focussed the specimen (e.g. particles being transported on an axon) and a sequence of images is collected at multiple time-points

Images are converted to binary (black and white) and combined into a single “t-stack” file (a scrollable time-lapse movie).

Manual tracking

Can be used to track intracellular particles/organelles or individuals within larger motile populations, e.g. cells.



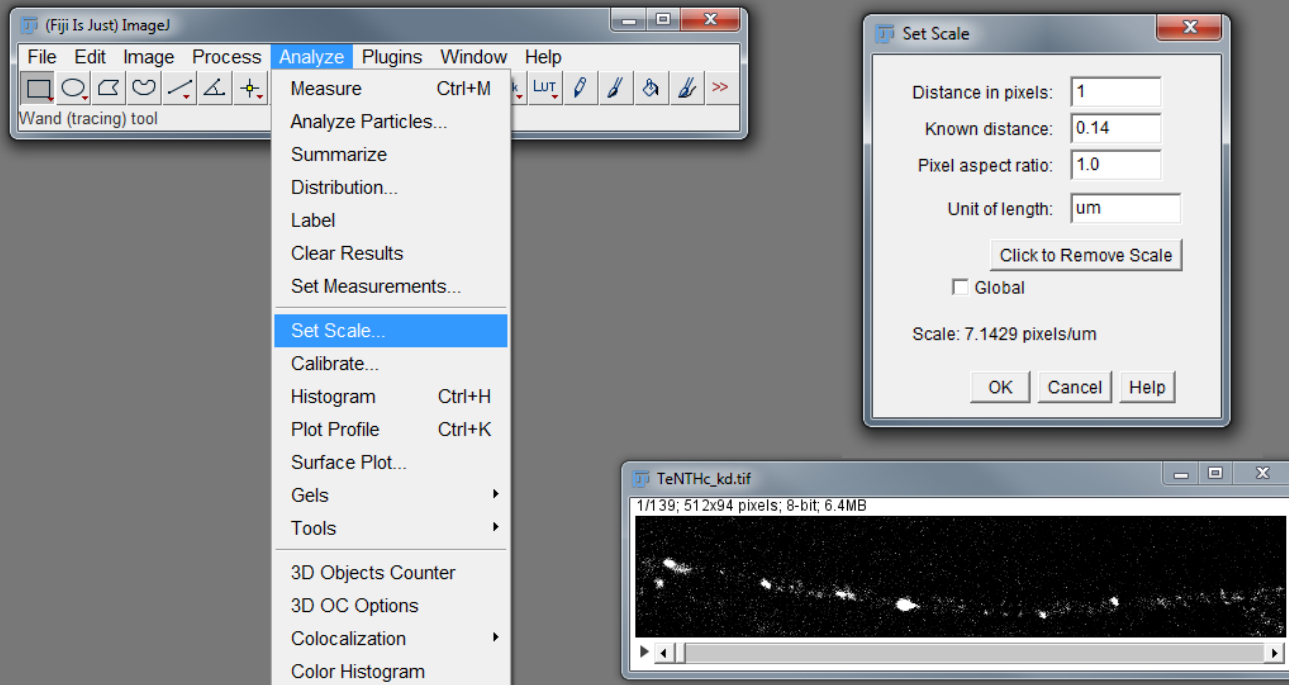
Measuring axonal transport

Calibrate the images:

Open image stack “TeNTHc_kd”.

Select Analyze>Set Scale...

Enter the microns/pixel and “um” as the unit of length and click “OK”



Measuring axonal transport

Open the manual tracking plugin:

Plugins>Tracking>Manual Tracking : <http://rsbweb.nih.gov/ij/plugins/track/track.html>

Tracking :

Add track	Delete last point	End track
Delete track n°	1	Delete all tracks

☐ Show path ?

Centring Correction:

Centring option : Local maximum

☐ Use centring correction ?

Directionality :

Add reference	Delete reference	No reference set
---------------	------------------	------------------

☐ Show reference ? ☐ Use directionality ?

Drawing :

Dots	Progressive Lines	Dots & Lines
Overlay Dots	Overlay Lines	Overlay Dots & Lines

☐ Show text ?

Load Previous Track File ☒ Show parameters ? Retrieve Z Coordinates

Parameters :

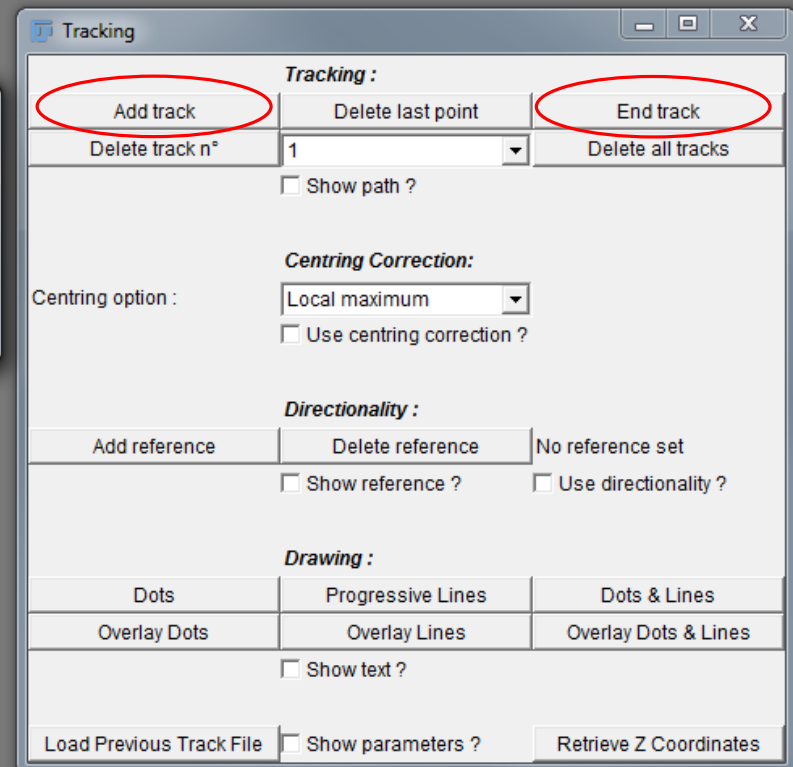
Time Interval :	5	sec
x/y calibration :	0.14	µm
z calibration :	0.0	
Search square size for centring:	5.0	pixels
Dot size :	5.0	
Line width :	1.0	
Font size :	12.0	

Enter the calibration parameters:
“Time interval” (seconds) and
“x/y calibration” (microns/pixel)

Measuring axonal transport

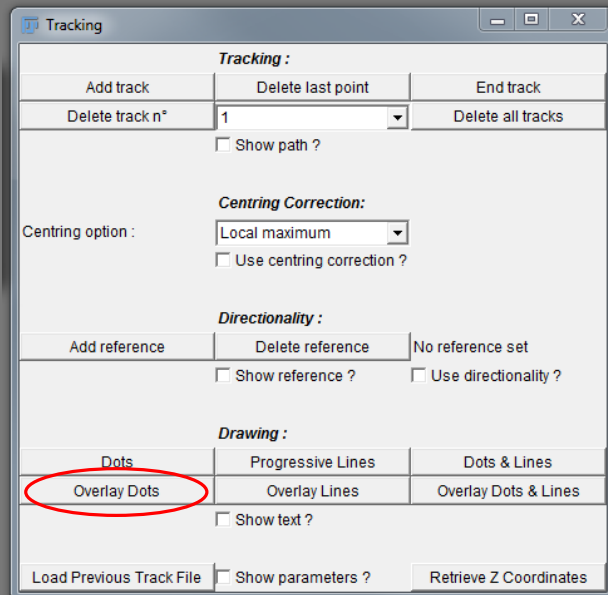


- ① To start the analysis of each particle, click “Add track”
- ② Using the mouse cursor, click on the particle that you want to track. The stack will increment by one frame. Continue clicking on the particle until you reach the end of its travel.
- ③ When you have finished tracking the particle, click “End track”. Click “Add track” to start tracking a new one.



Measuring axonal transport

As you end each track, data showing the distance travelled per frame and velocity are added to the results window. This data can be copied and pasted into excel for further analysis



The 'Results from TeNTHc_kd in µm per sec' window displays a table with the following data:

	Track n°	Slice n°	X	Y	Distance	Velocity	Pixel Value
1	1	1	26	38	-1.000	-1.000	255
2	1	2	98	47	10.158	2.032	255
3	1	3	148	57	7.139	1.428	255
4	1	4	218	65	9.864	1.973	255
5	1	5	286	72	9.570	1.914	255
6	1	6	380	67	13.179	2.636	96
7	1	7	438	63	8.139	1.628	147
8	1	8	509	56	9.988	1.998	255
9	2	10	14	33	-1.000	-1.000	255
10	2	11	142	55	18.183	3.637	255
11	2	12	219	63	10.838	2.168	255
12	2	13	310	69	12.768	2.554	255
13	2	14	408	64	13.738	2.748	255
14	2	15	506	56	13.766	2.753	255
15	2	30	50	43	63.866	12.773	255
16	2	31	103	54	7.578	1.516	255
17	2	32	147	60	6.217	1.243	239

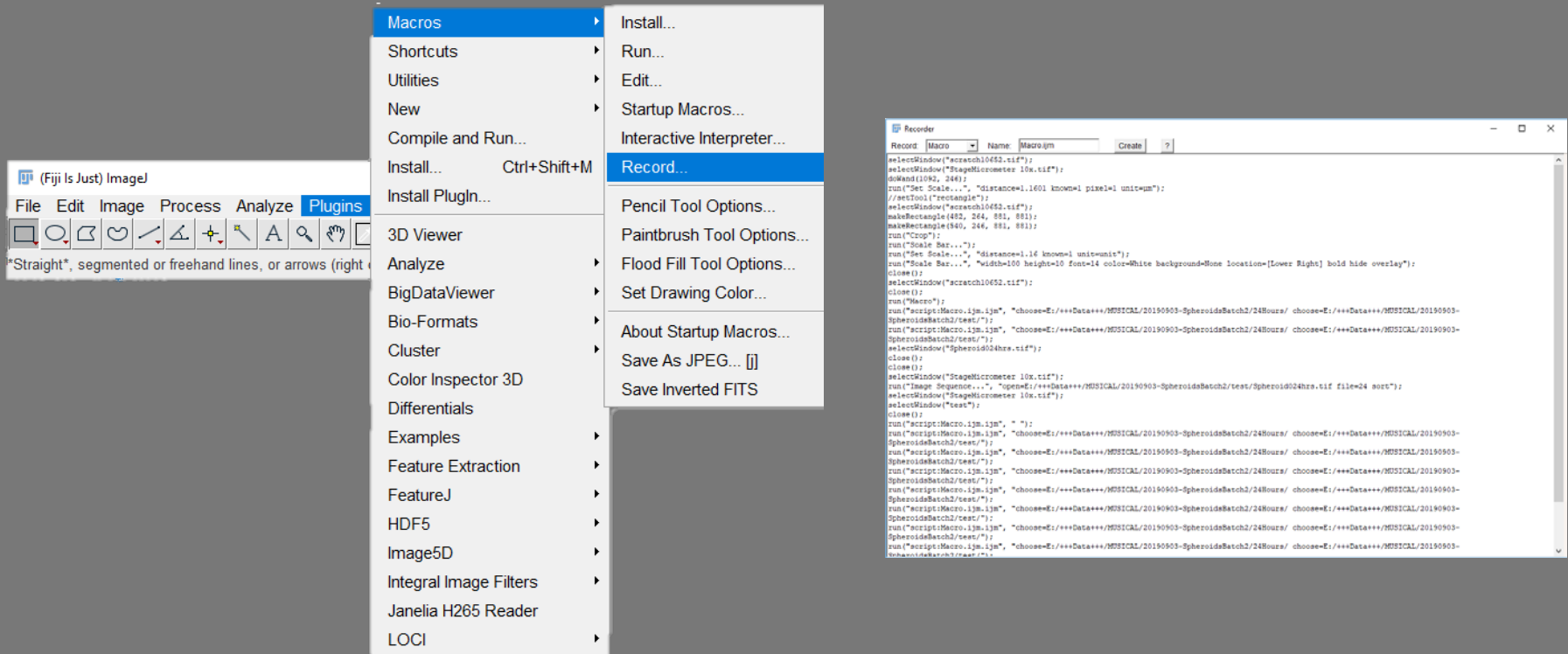
You can review the particles that you have tracked by clicking on the “Overlay Dots” function.

Macros

Macros are a series of code steps used to process images in a quick and repeatable way

ImageJ macros are based on java but you don't need to know java to create one

The macro recorder tool allows you to easily turn image analysis steps into a script



Macros

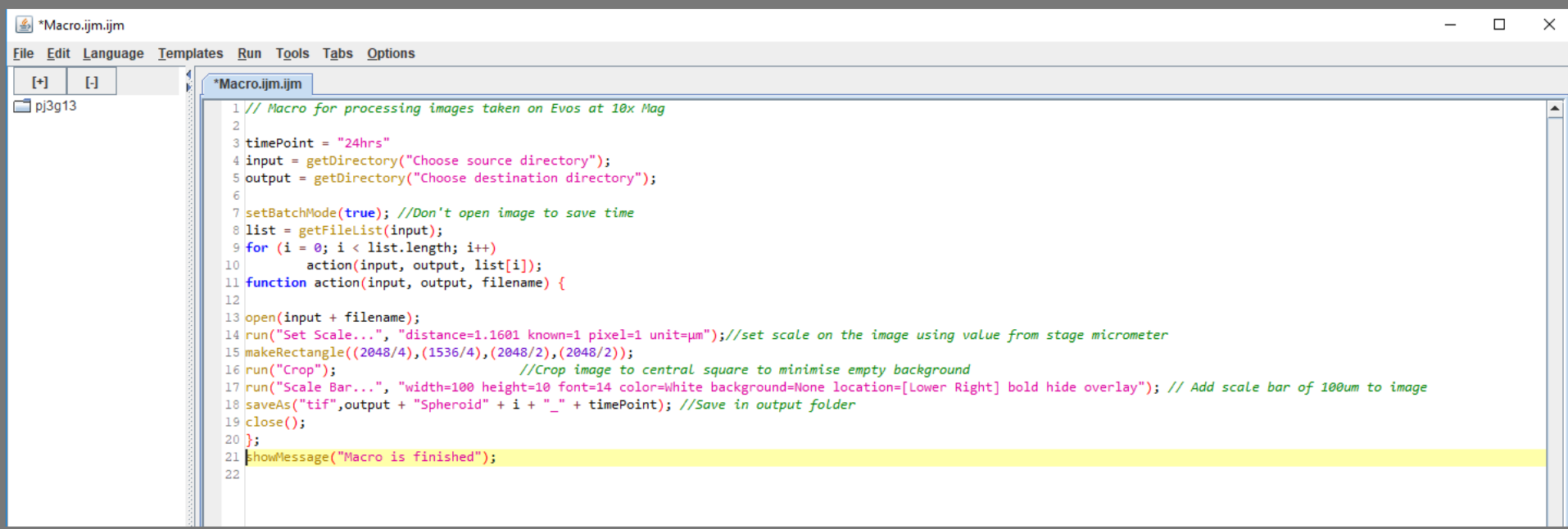
To create a new macro go to **Plugins > New > Macro**

You can copy and paste step from the recorder into the macro

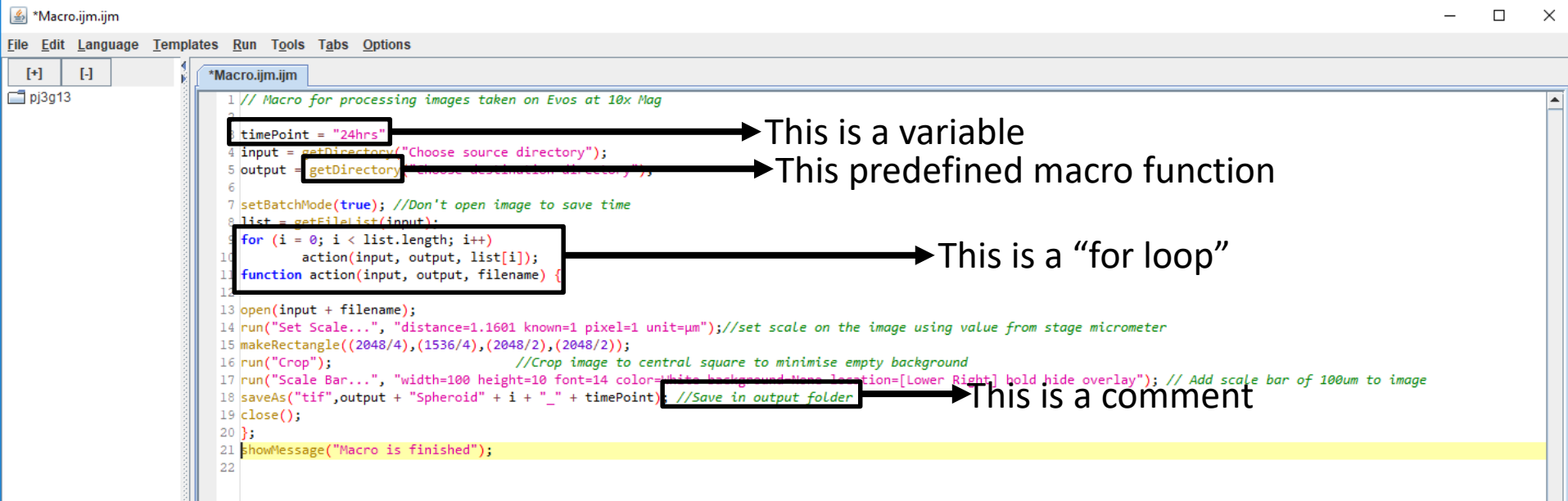
They can be saved as macro files or as text documents

An example macro

This macro takes a folder of images, crops them, scales them, adds a scale bar and saves them into a new folder with meaningful names.

A screenshot of the Fiji macro editor window. The title bar reads '*Macro.ijm.ijm'. The menu bar includes 'File', 'Edit', 'Language', 'Templates', 'Run', 'Tools', 'Tabs', and 'Options'. Below the menu bar are buttons for '[+]' and '[-]', and a file explorer icon next to 'pj3g13'. The main text area contains a macro script for processing images. The script starts with a comment: '// Macro for processing images taken on Evos at 10x Mag'. It sets 'timePoint = "24hrs"', gets source and destination directories, sets batch mode to true, gets a file list, and loops through each file. Inside the loop, it calls an 'action' function. The 'action' function opens the image, sets a scale bar (1.1601 micrometers), crops the image to a central square, adds a scale bar (100 micrometers), saves as a TIFF file, and closes the image. The macro ends with a message box 'Macro is finished'.

```
1 // Macro for processing images taken on Evos at 10x Mag
2
3 timePoint = "24hrs"
4 input = getDirectory("Choose source directory");
5 output = getDirectory("Choose destination directory");
6
7 setBatchMode(true); //Don't open image to save time
8 list = getFileList(input);
9 for (i = 0; i < list.length; i++)
10     action(input, output, list[i]);
11 function action(input, output, filename) {
12
13     open(input + filename);
14     run("Set Scale...", "distance=1.1601 known=1 pixel=1 unit=µm");//set scale on the image using value from stage micrometer
15     makeRectangle((2048/4),(1536/4),(2048/2),(2048/2));
16     run("Crop"); //Crop image to central square to minimise empty background
17     run("Scale Bar...", "width=100 height=10 font=14 color=white background=None location=[Lower Right] bold hide overlay"); // Add scale bar of 100µm to image
18     saveAs("tif",output + "Spheroid" + i + "_" + timePoint); //Save in output folder
19     close();
20 };
21 showMessage("Macro is finished");
22
```



Variables can be numbers, strings, arrays etc their value can change which is useful

ImageJ has hundreds of predefined macro functions that streamline the process of image analysis, you can find a list Googling "ImageJ macro functions"

For Loops, allow you to repeat the same set of commands for multiple images without needing outside input

Comments are bits of code that the computer doesn't read and are marked with a "//", commenting macros is useful to remind yourself what each step is doing

Macros

An example macro for analysis of images

```
*Macro.ijm.ijm  *New_.ijm

1 source = getDirectory("Choose source directory");
2 array = getFileList(source);
3 Array.show(array);
4 open(source + "/" + array[0]);
5 rename("perp");
6 open(source + "/" + array[1]);
7 rename("par");
8
9 imageCalculator("Add create 32-bit stack", "perp", "perp");
10 rename("2perp");
11 imageCalculator("Add create 32-bit stack", "par", "2perp");
12 rename("T");
13 imageCalculator("Subtract create 32-bitstack", "par", "perp");
14 rename("D");
15 imageCalculator("Divide create stack", "D", "T");
16 selectWindow("Result of D");
17 rename("D over T");
18 saveAs("Tiff", source + getTitle());
19 close();
20 saveAs("Tiff", source + getTitle());
21 close();
22 saveAs("Tiff", source + getTitle());
23 run("Close All");
24 run("Close All");
25 source = getDirectory("Choose source directory");
26 open(source + "/" + "T.tif");
27
28 run("Make Substack...", " slices=2"); //open total intensity image
29 run("Enhance Contrast", "saturated=0.35");
30 setAutoThreshold("Default dark");
31 run("Threshold..."); // set threshold to remove BG pixels
32 waitForUser("Set threshold");
33 setOption("BlackBackground", false);
34 run("Convert to Mask"); // turn thresholded image into mask
35 run("Median...", "radius=1"); //median filter to smooth out random pixels in areas of signal
36 run("Create Selection");
37 run("Create Mask"); //Turn into useable mask
38 saveAs("Tiff", source + getTitle());
39 open(source + "/" + "D over T.tif");
40 run("Make Substack...", " slices=2");
41 rename("aniso");
42 imageCalculator("Multiply create", "aniso", "Mask.tif"); // multiply anisotropy image by mask to turn BG pixels to 0 and signal to 255*aniso score
43 saveAs("Tiff", source + "Aniso_times_mask");
44 run("Divide...", "value=255"); // return aniso values to correct value
45 saveAs("Tiff", source + "Divide_by_255");
46 run("Close All");
```