

High throughput image analysis of trypanosomatids – differential DNA staining and colour deconvolution

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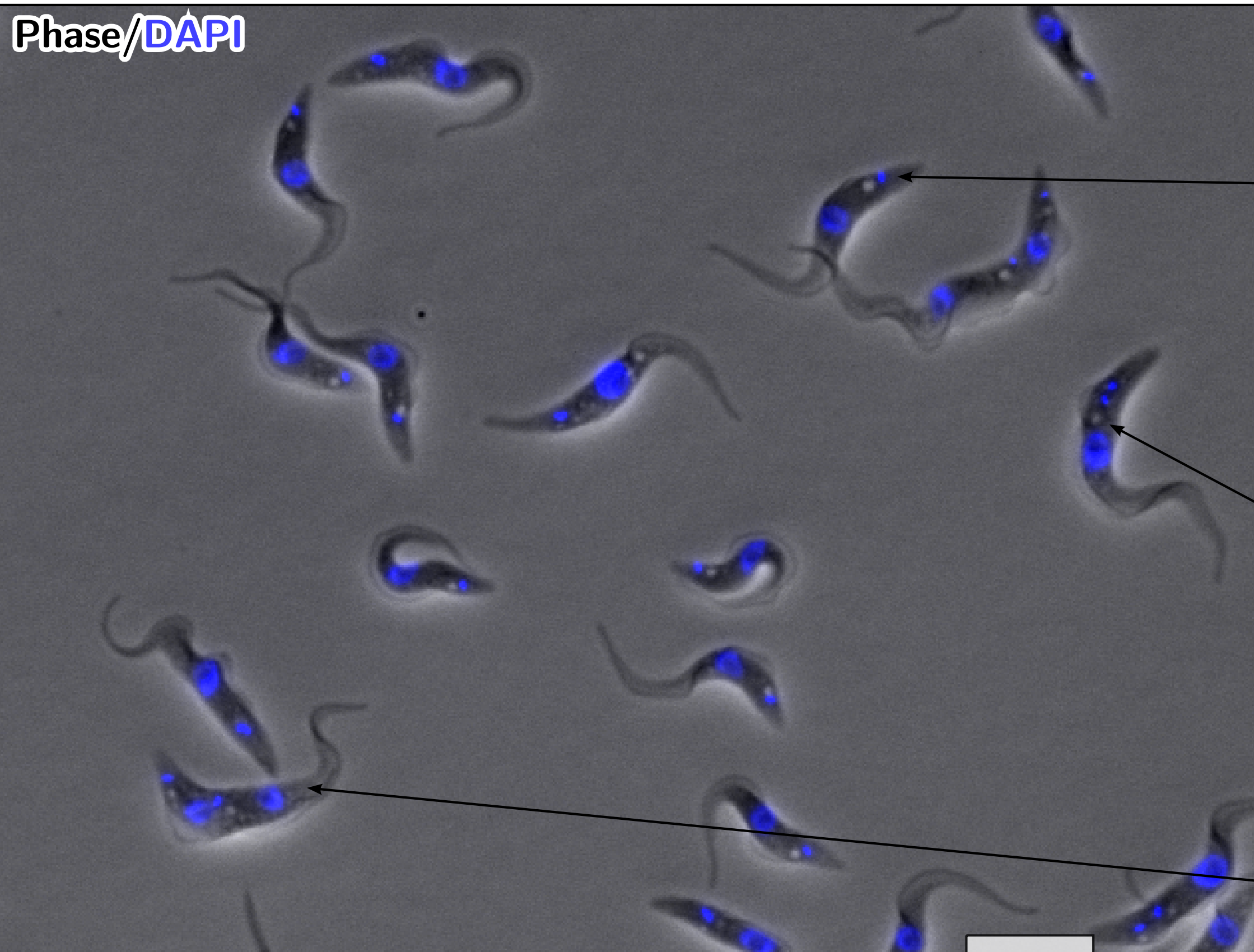
1. DNA in trypanosomatids

Kinetoplastids are an order of parasitic protozoa which includes the major human pathogens *Trypanosoma brucei*, *Trypanosoma cruzi* and *Leishmania* spp. Kinetoplastids share several distinctive features:

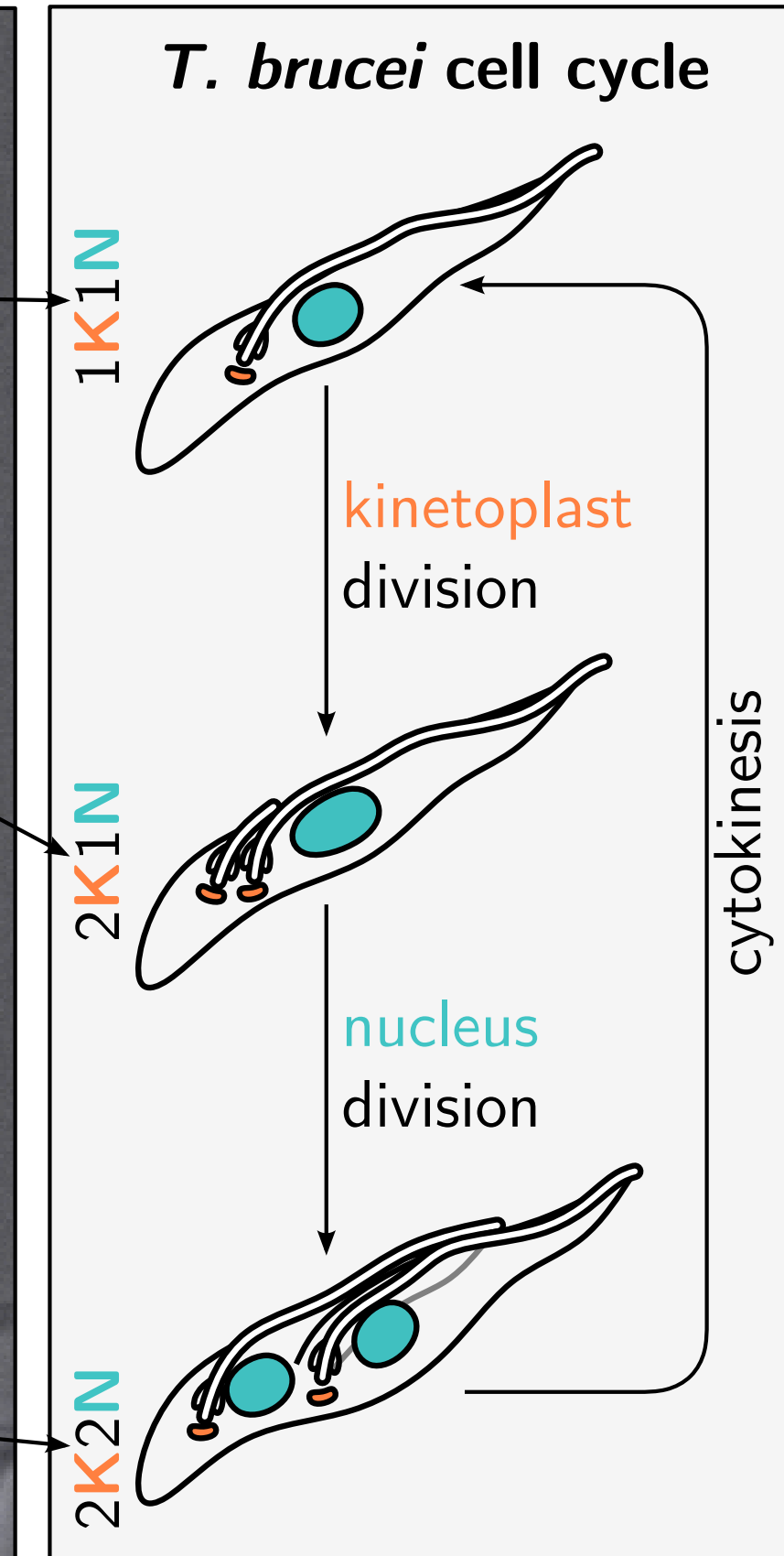
- A highly structured cell body with a microtubule-based cytoskeleton and a single flagellum
- A **kinetoplast**; the mitochondrial DNA which is found at the base of the flagellum
- Single copies of vital organelles including the **nucleus**, **kinetoplast**, flagellum and mitochondrion

Possession of two large DNA-containing organelles complicates automated image analysis; the **kinetoplasts** and **nuclei** must be reliably identified.

Phase/DAPI



T. brucei cell cycle



Trypanosomatids have a complex and rigid ultrastructure and a highly choreographed cell cycle. Detection of deviation from normal morphology and the normal cell cycle is used to:

- Analyse reverse genetic mutants to infer protein function
- Screen potential drug candidates to detect anti-trypanosomatid activity
- Detect and analyse life-cycle stage differentiation, which normally involves modified division

Cell morphology and behaviour of cells through the cell cycle is routinely analysed by the **nucleus** and **kinetoplast** number. This is the analysis technique I have automated *and* extended.

2. Identifying DNA by sequence bias

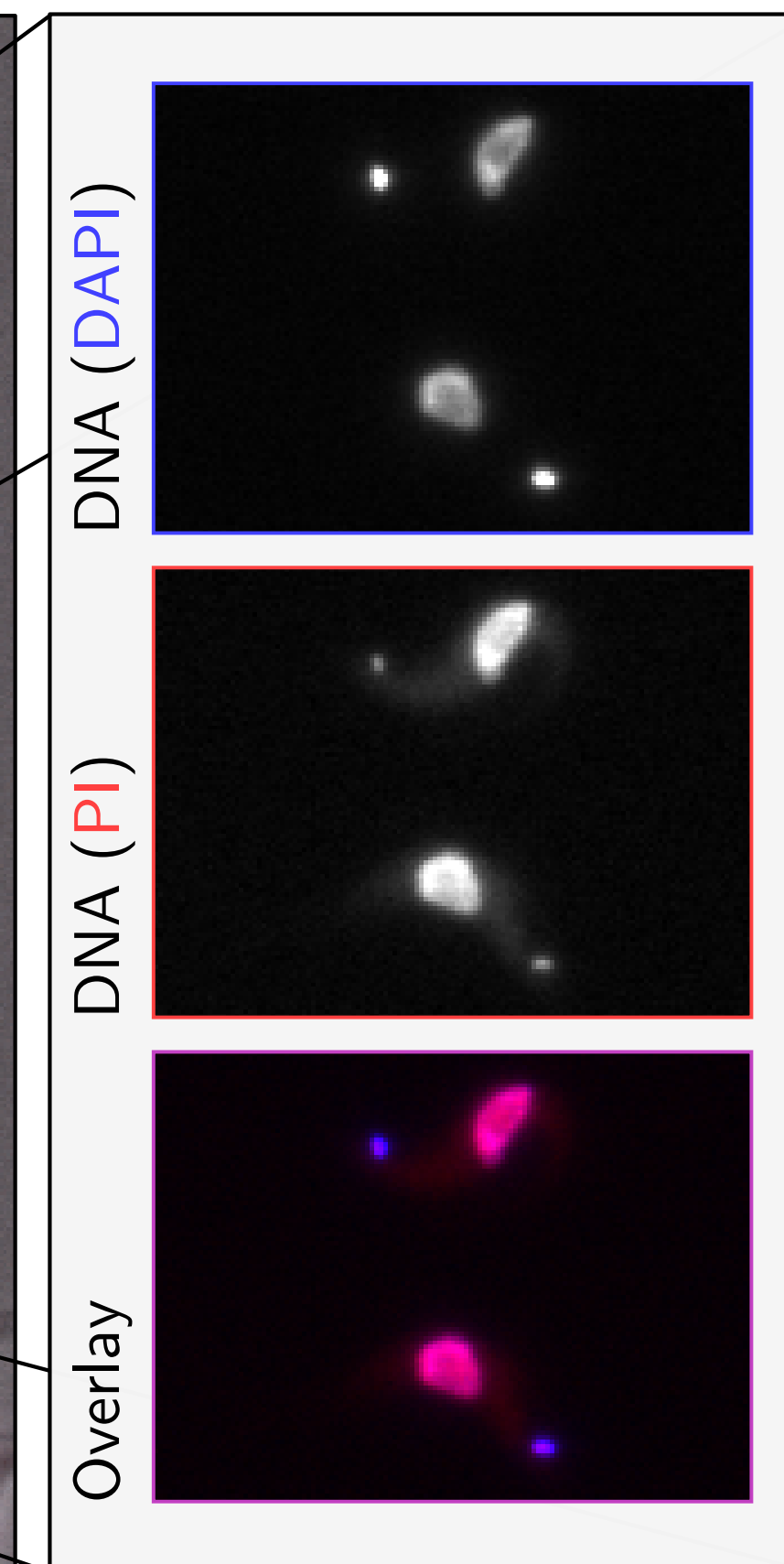
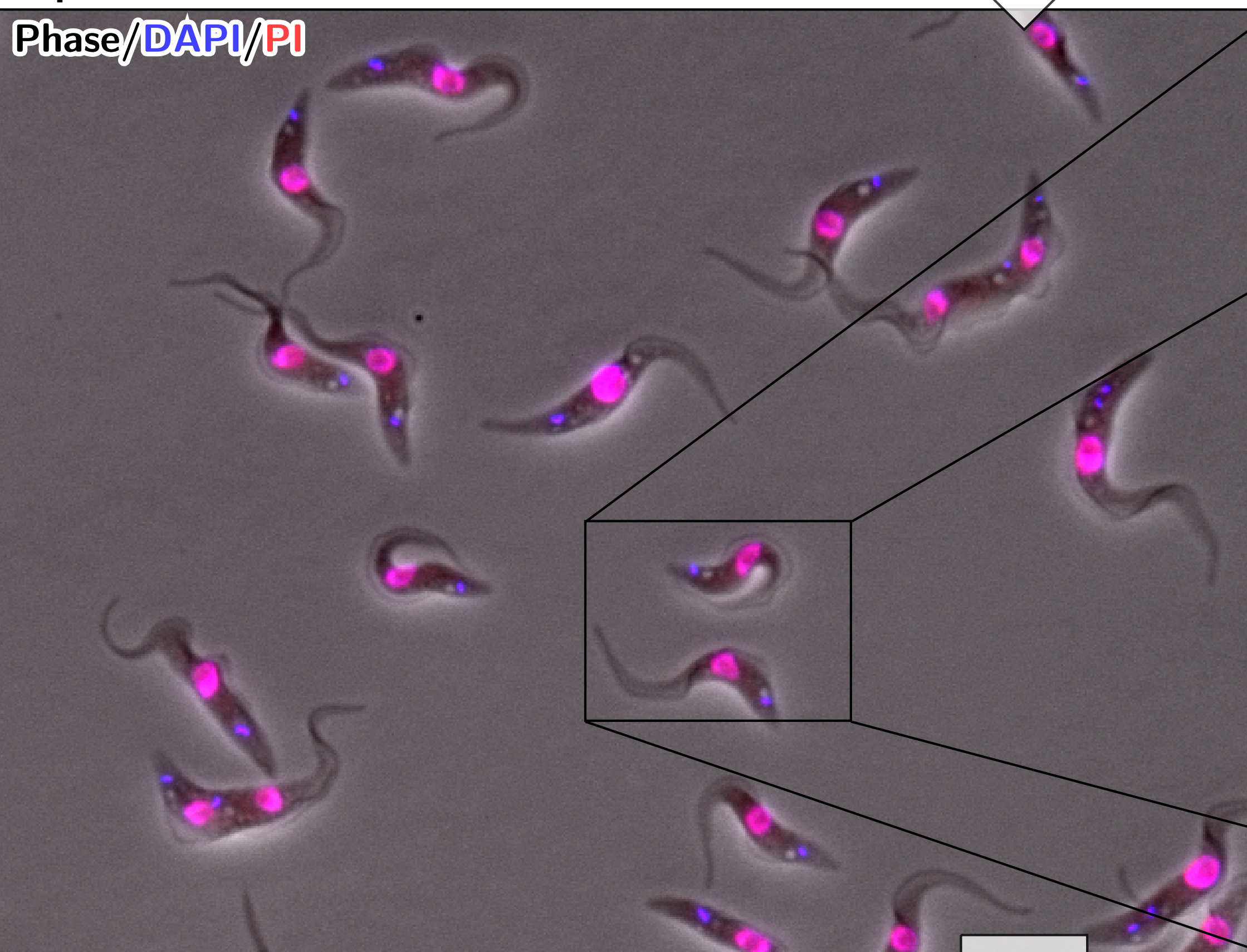
Using two different DNA stains we can identify the **kinetoplast** and **nucleus** automatically; different DNA stains have different sequence binding biases so label **kinetoplasts** and **nuclei** differently.

There are two main classes of DNA binding small molecule fluorescent stains:

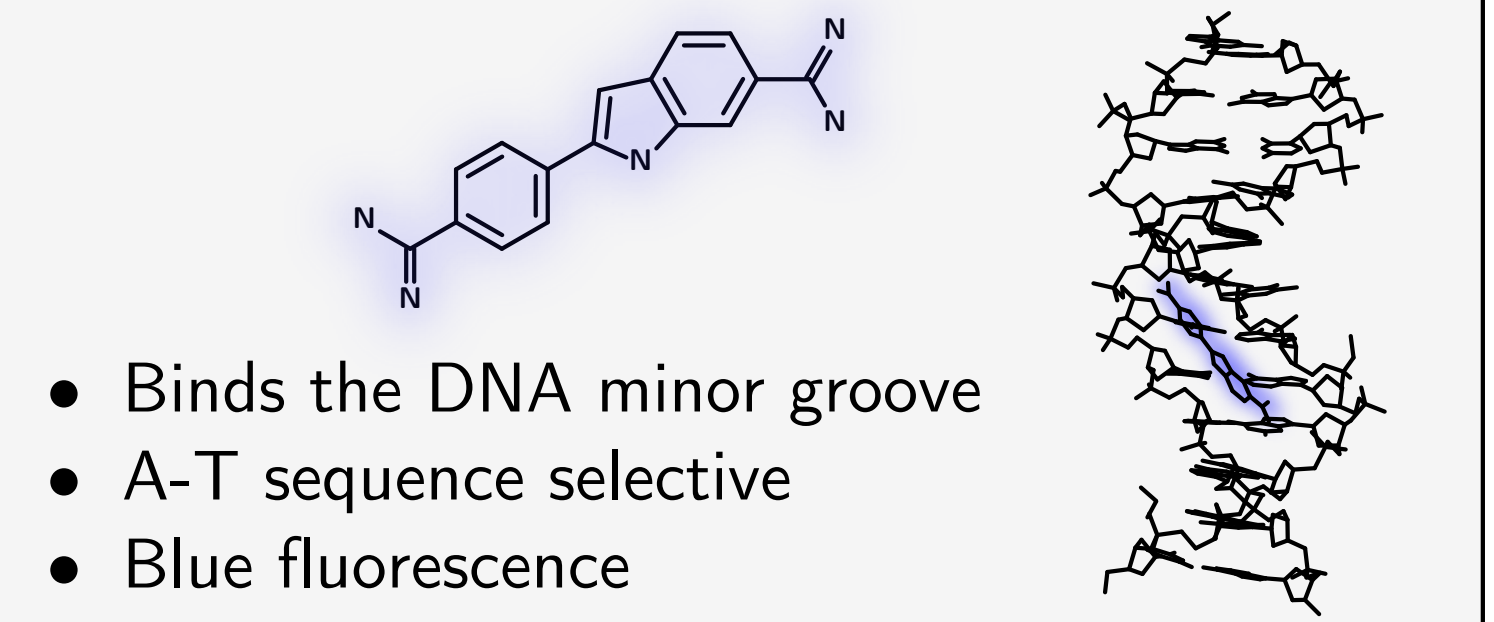
- Base pair intercalating
e.g. **propidium iodide (PI)**, SYBR green, ethidium bromide
- Minor groove binding
e.g. **DAPI**, Hoechst

Minor groove binding stains tend to prefer A-T rich DNA sequences. **Kinetoplast** DNA is A-T rich so binds **DAPI** strongly.

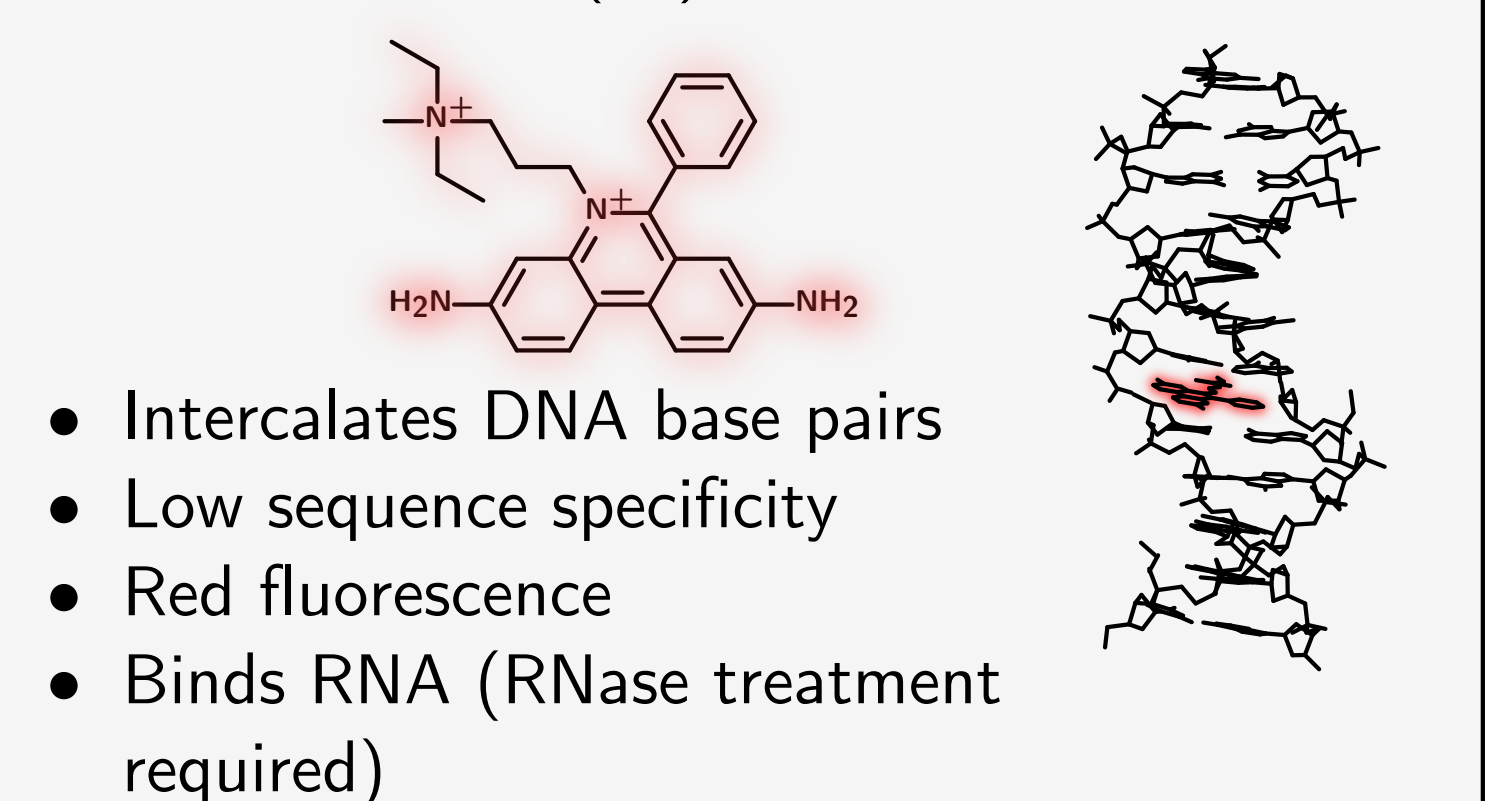
Phase/DAPI/PI



DAPI



Propidium iodide (PI)



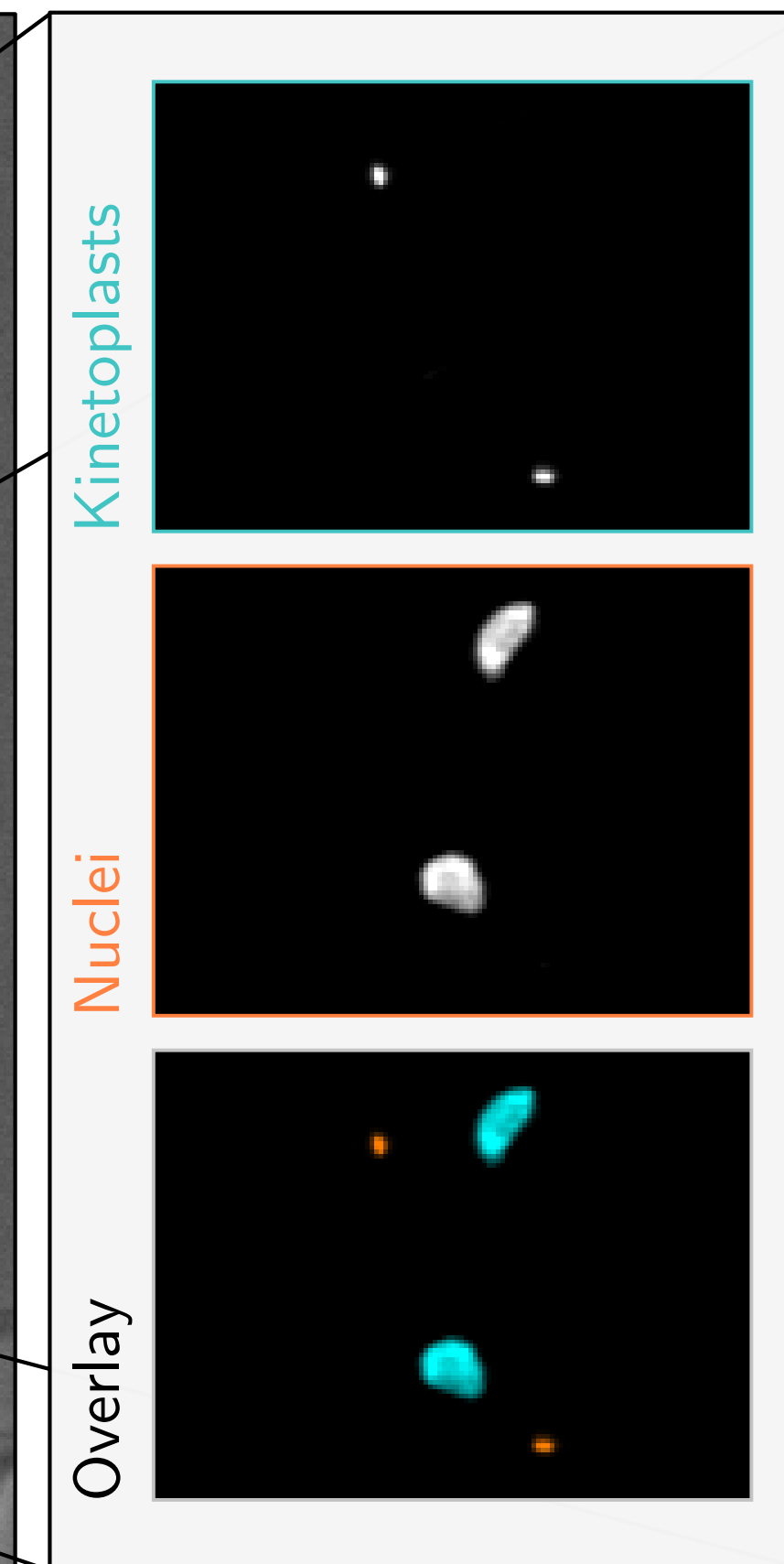
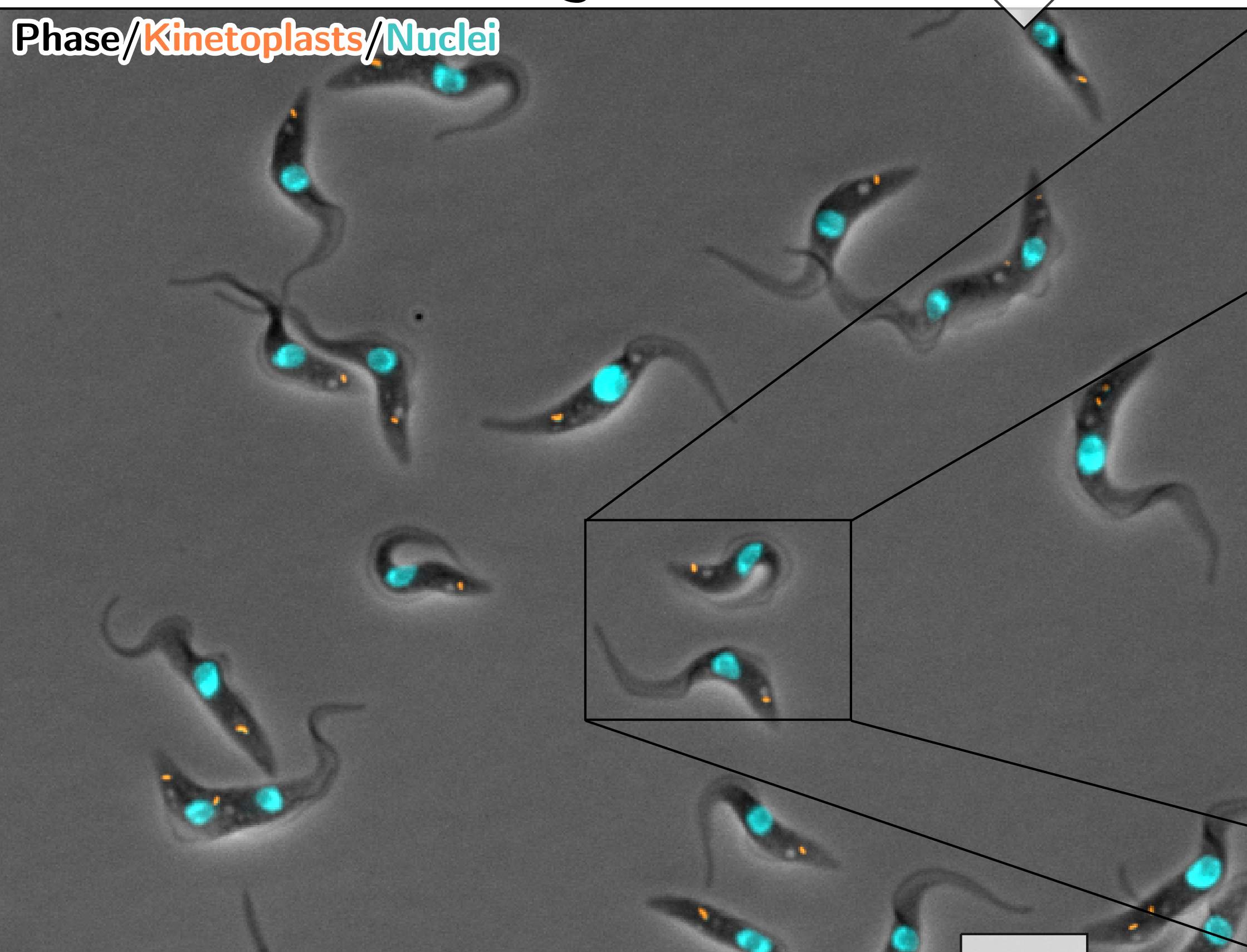
3. Separating kinetoplast and nucleus signal

Using colour deconvolution we can separate the **kinetoplasts** and **nuclei** from the **DAPI** and **PI** fluorescence images to to simplify automatic analysis.

Colour deconvolution is calculated using reference intensity values and the **DAPI** and **PI** values of a pixel. Image processing takes four steps, all are fully automatic:

1. Measure chromatic aberration between the **DAPI** and **PI** images
2. Correct chromatic aberration with a linear scaling of the **PI** image
3. Measure the reference **DAPI** and **PI** values for **kinetoplasts** and **nuclei**
4. Perform colour deconvolution to produce **kinetoplast** and **nucleus** images

Phase/Kinetoplasts/Nuclei



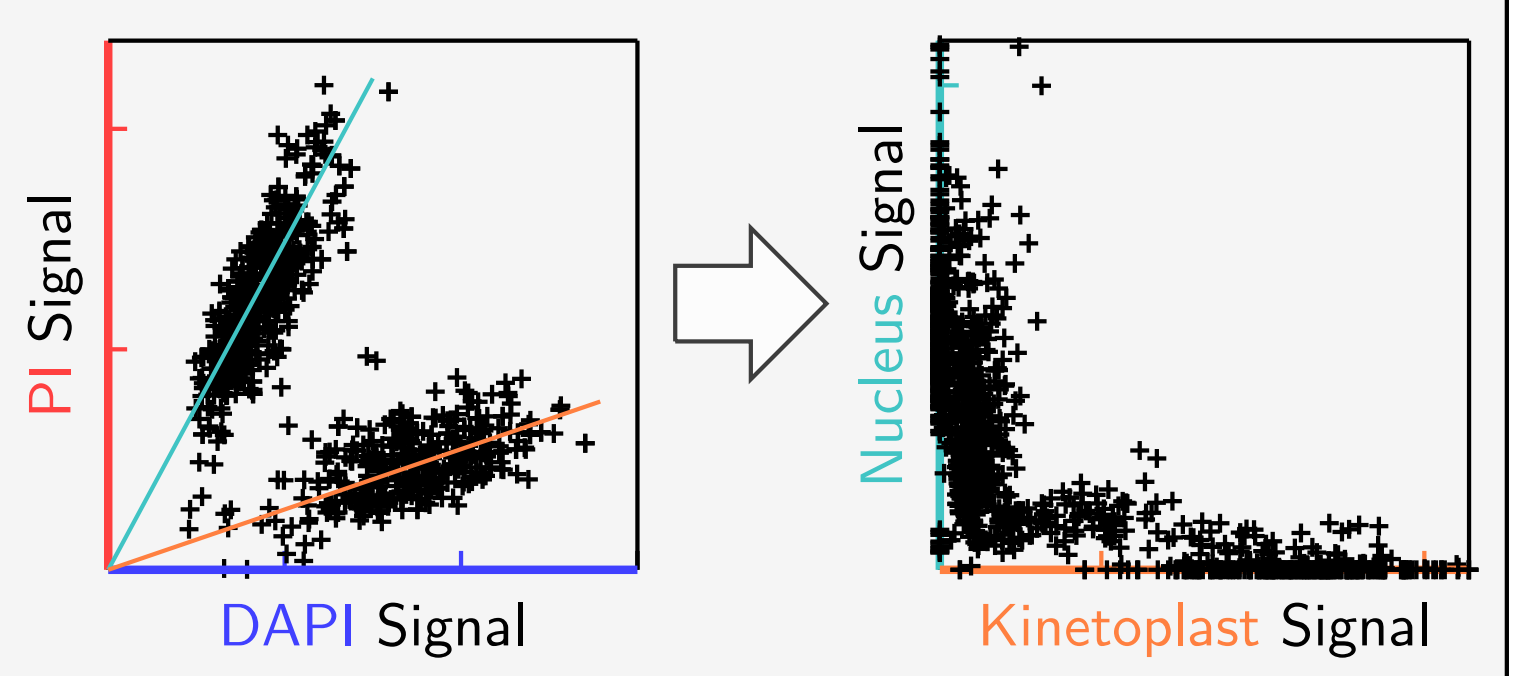
Mathematically colour deconvolution is a change in basis in two dimensions.

$$\mathbf{p}' = \mathbf{M}^{-1} \mathbf{p}$$

Where \mathbf{p} is the **DAPI/PI** pixel value and \mathbf{p}' is the **kinetoplasts/nuclei** pixel value. The transformation matrix, \mathbf{M} , is given by:

$$\mathbf{M} = (\mathbf{k}, \mathbf{n})$$

Where \mathbf{k} and \mathbf{n} are the reference **DAPI/PI** values for a kinetoplast and nucleus respectively.



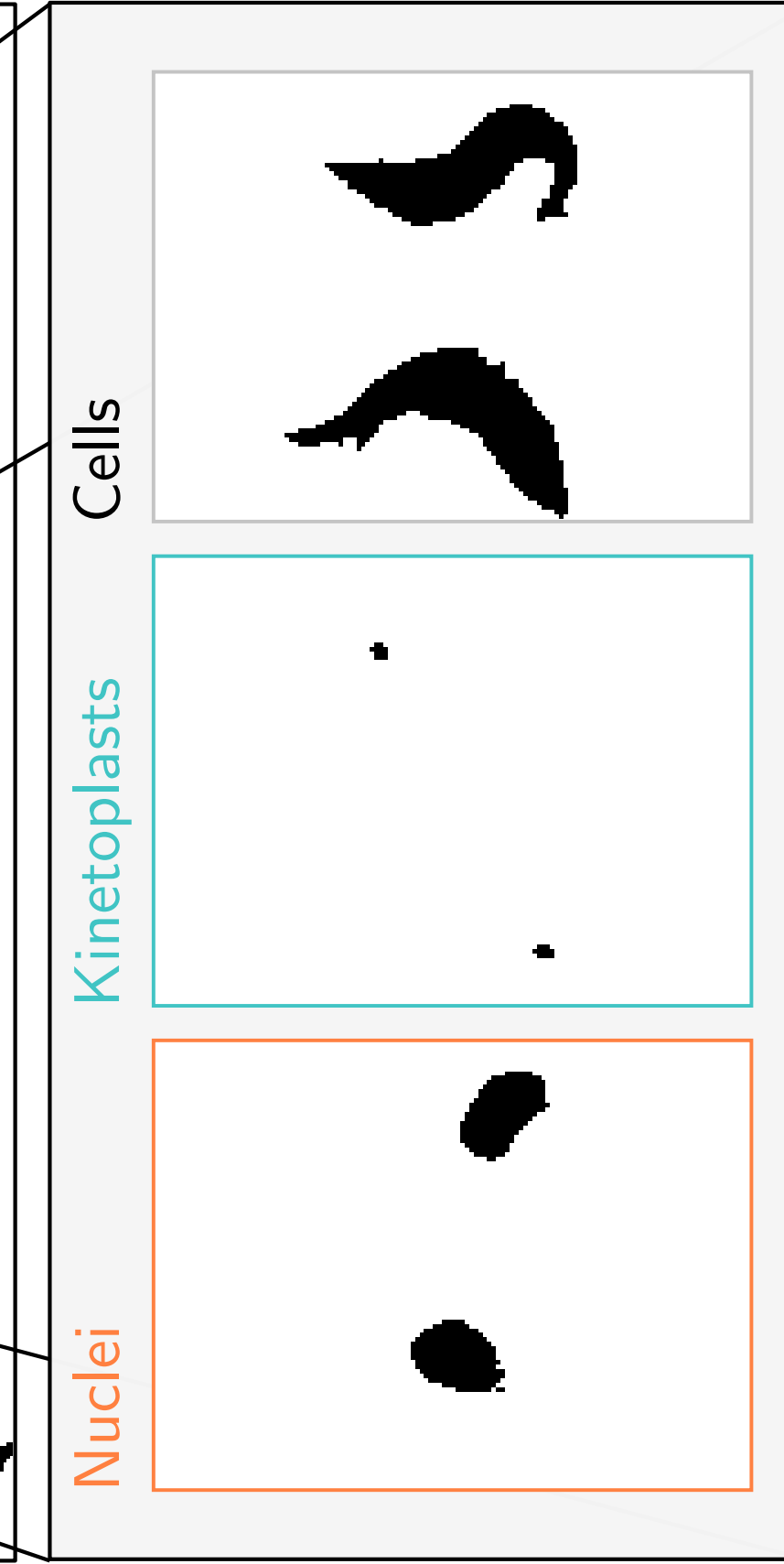
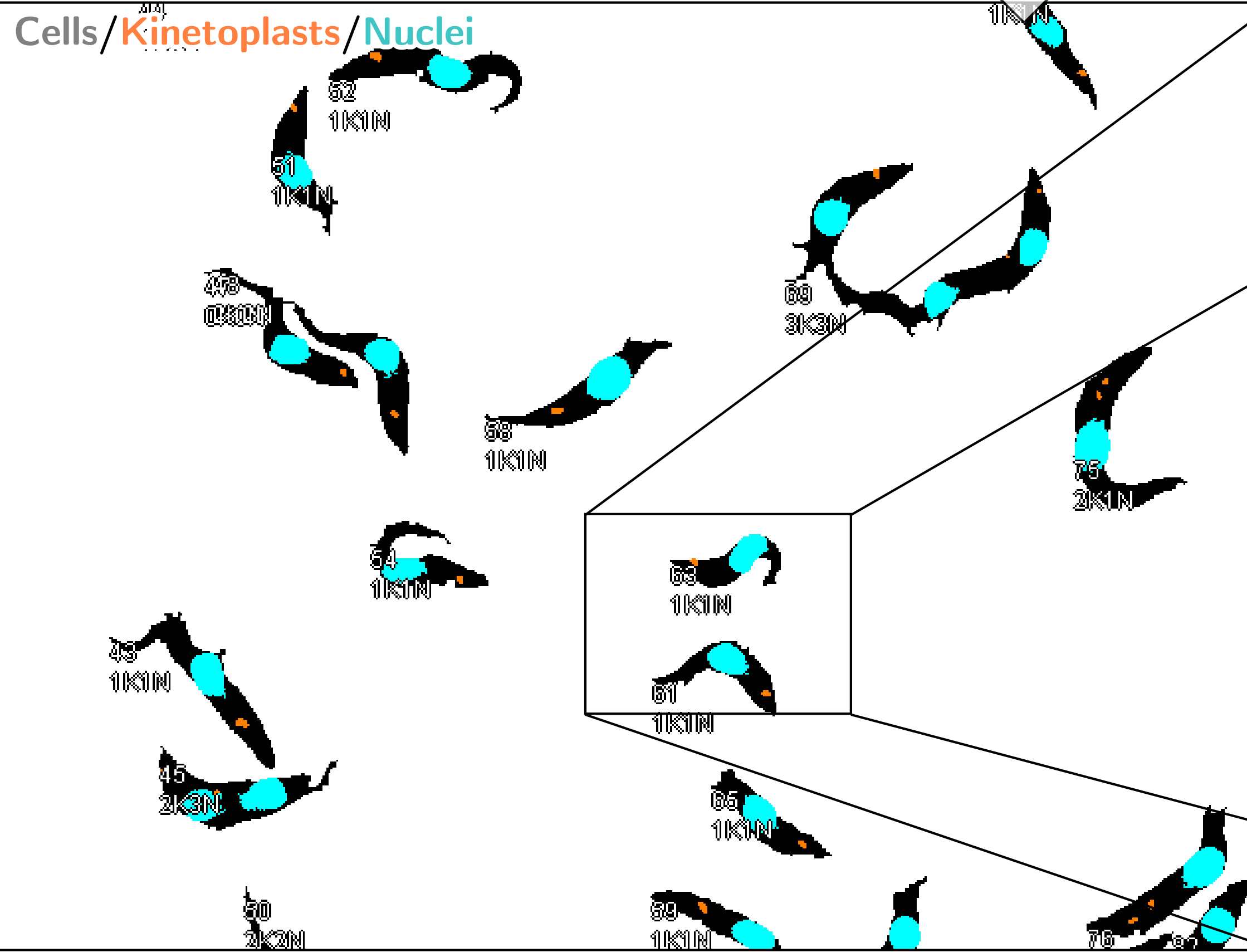
4. Automation of image analysis

Colour deconvolution generates quantitative and easy to analyse images of the **kinetoplasts** and **nuclei**. We have designed tools to automate analysis of these images.

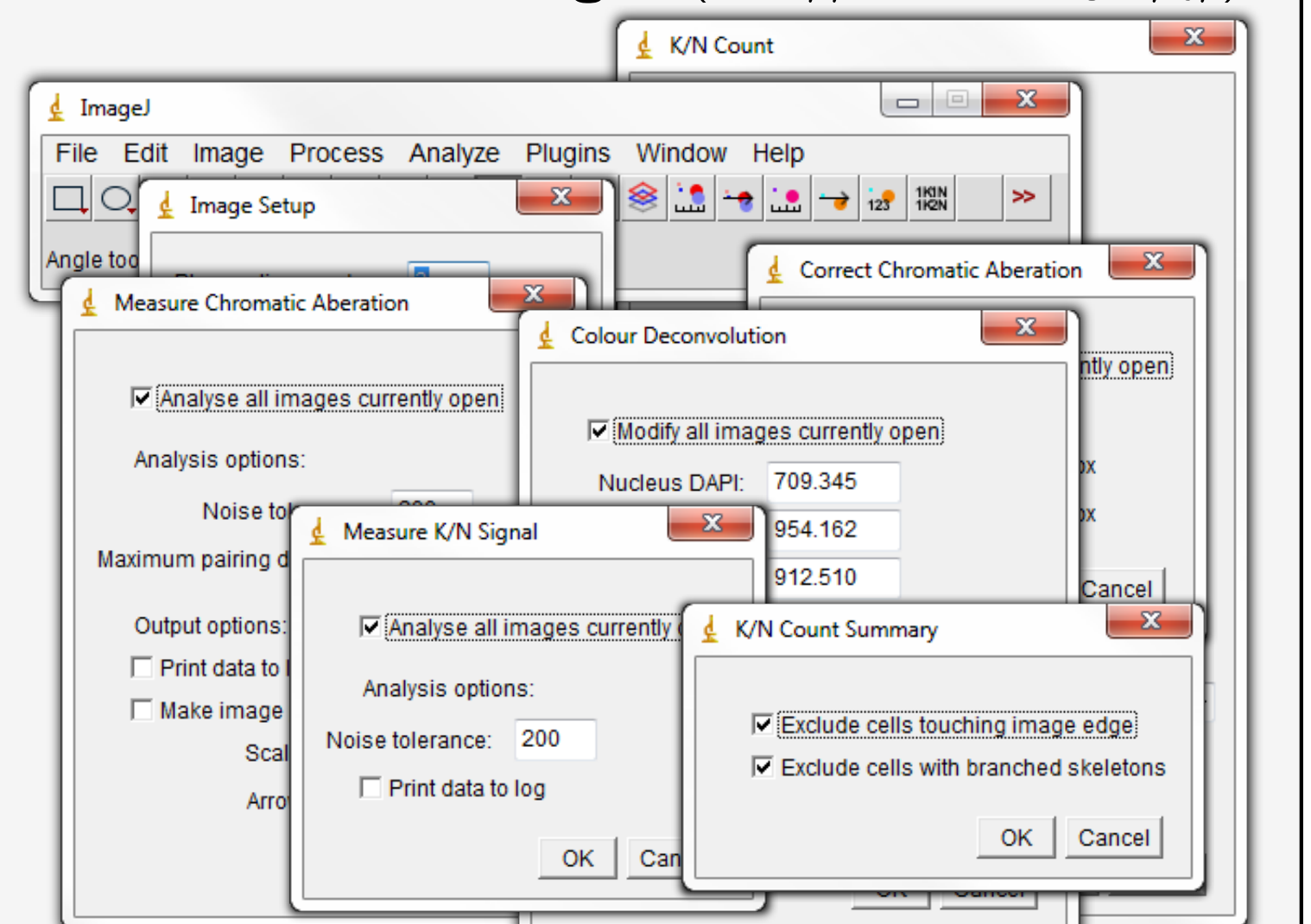
Image analysis uses simple intensity thresholding to identify cells, **nuclei** and **kinetoplasts**. Automated analysis takes three steps, all are fully automatic:

1. Intensity threshold **kinetoplast** and **nucleus** images, subtract background and threshold phase image
2. Analyse cell shape using a medial axis transform and extract cell width, length and shape data
3. Measure **kinetoplast** and **nucleus** properties from the deconvolved images including DNA quantity and organelle location

Cells/Kinetoplasts/Nuclei



All these processes have been fully automated in the form of a set of macro tools for use in ImageJ (<http://rsbweb.nih.gov/ij/>).



A typical image can be processed in 10–15s. With around 50–100 cells per image these macros can analyse around 20000 cells per hour.