

# Spectral Imaging

Biology 177

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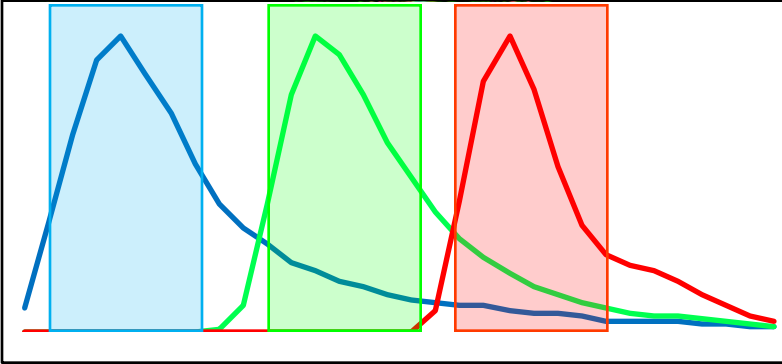
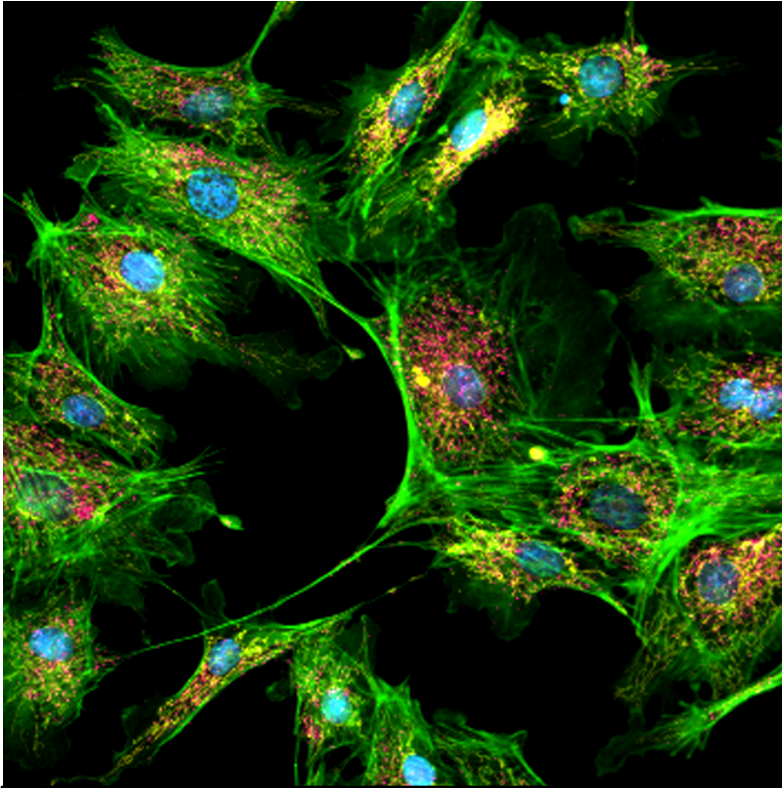
Steven Wilbert

Spectral imaging: what is it  
and why should I use it?

# Why spectral imaging?

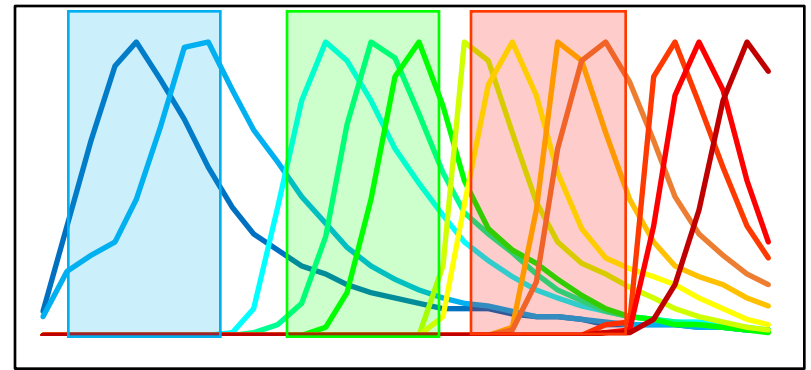
## Conventional

BPAE Cells - 3 Colors

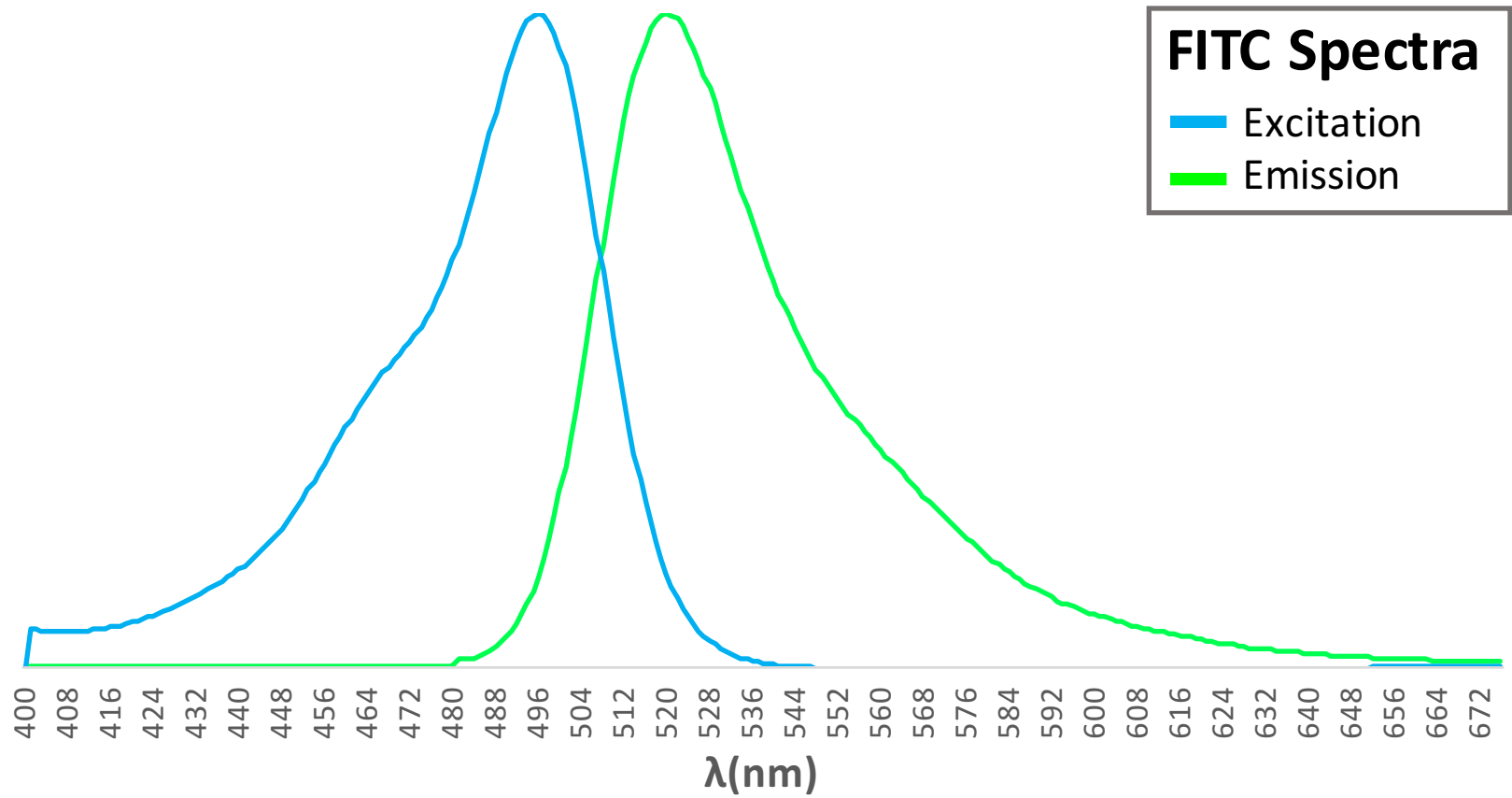


## Spectral

Oral Plaque Biofilm - 12 Colors



# Fluorescence spectra





How do we collect spectral  
datasets?

# Types of Spectral detection

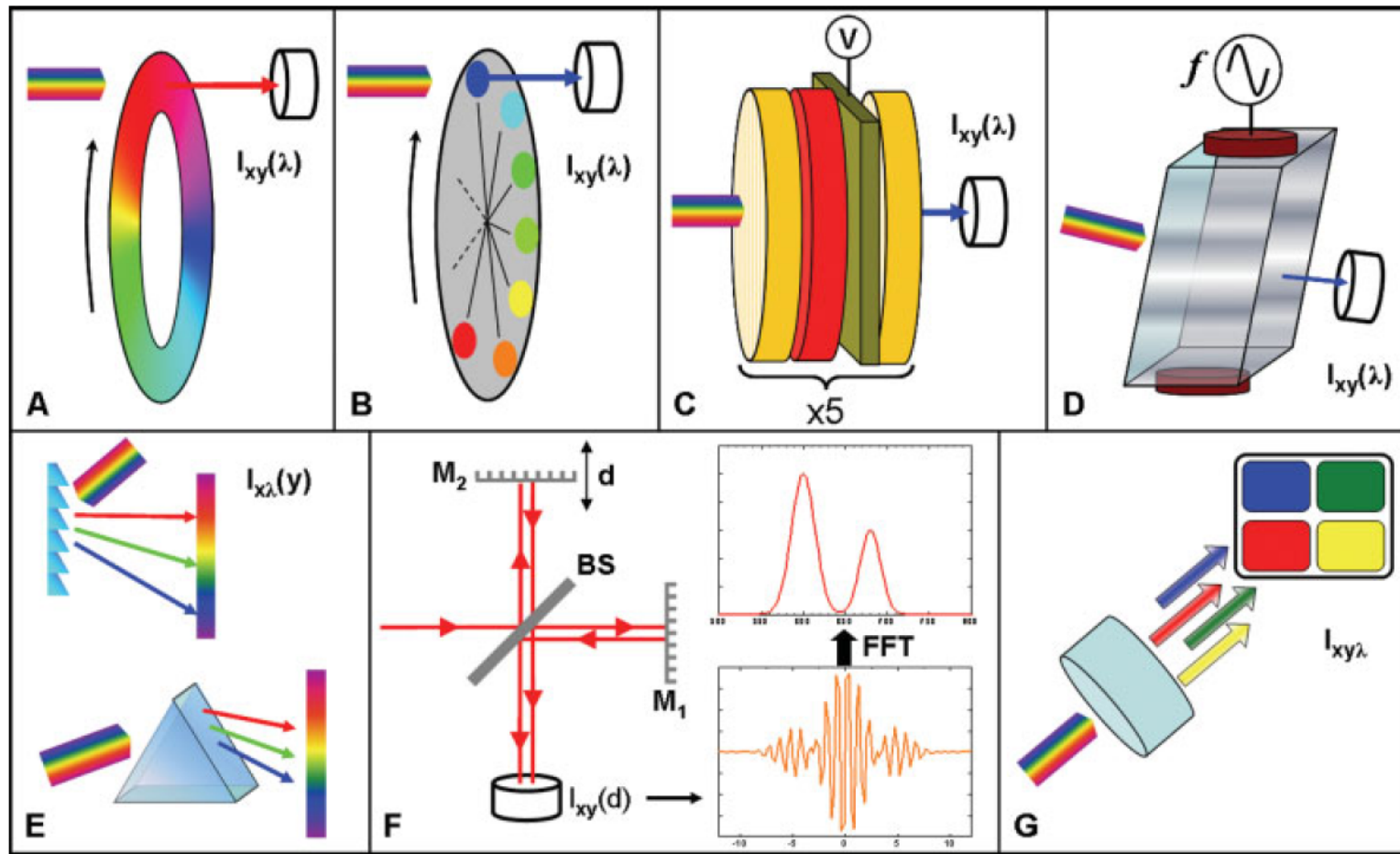
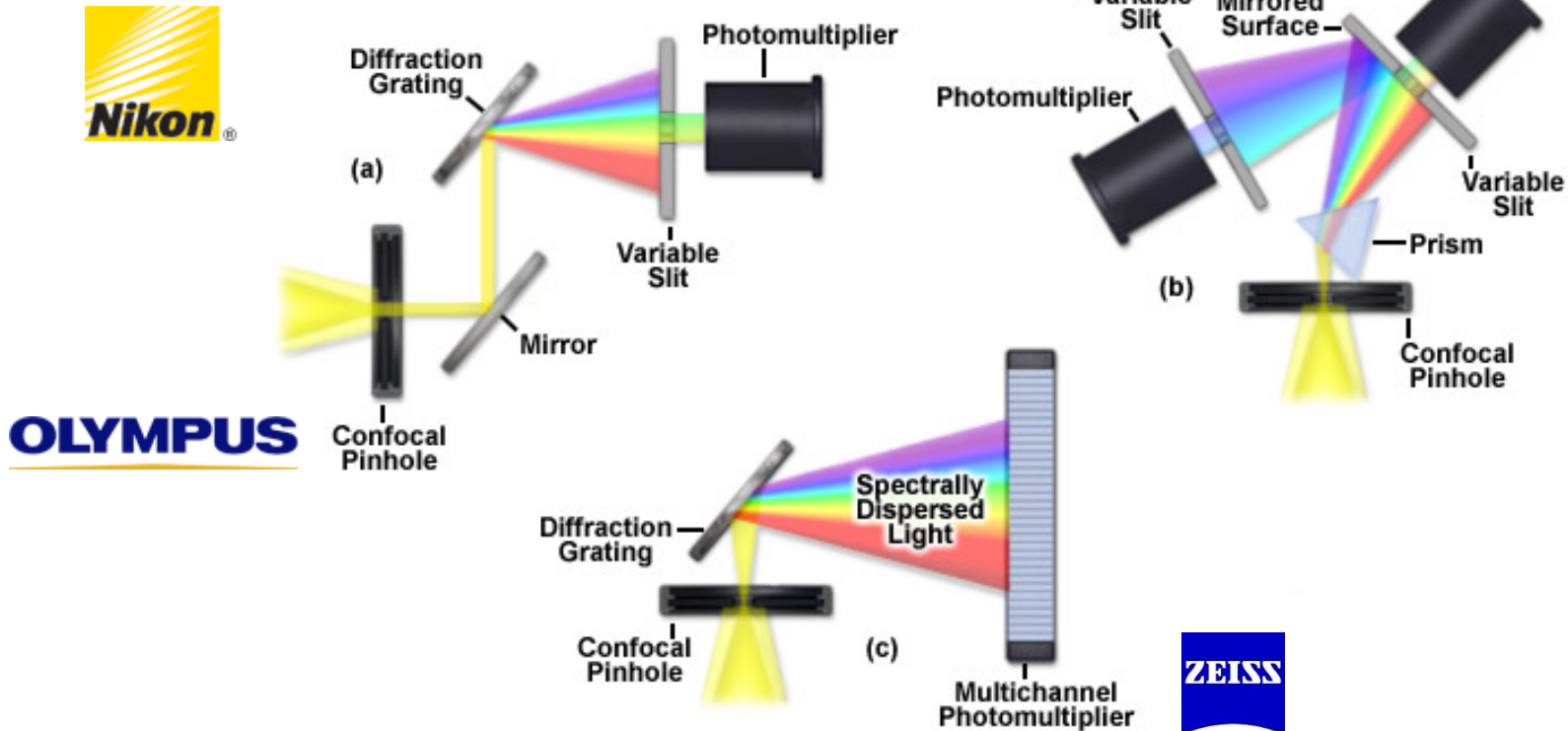


FIG. 3. Various methods of spectral imaging systems. They can be divided into four main methods: wavelength-scan (A–D), spatial scan (E), time scan (F) and “compromise” methods (G). In wavelength-scan methods, the whole image is measured one wavelength at a time. This can be realized using either a circular variable filter (A), a set of filters (B), a liquid crystal variable filter (C) or an acousto-optic variable filter (D). Spatial-scan methods use a dispersion element, either a grating or prism (E) and the image has to be scanned along at least one axis. There are also confocal microscopes that use a dispersive element and scan the image point by point. In time-scanning method (F), the whole image is measured after passing through an interferometer (or other optical elements). In order to calculate the spectrum at each pixel a mathematical transformation has to be carried out, for example, a Fourier transform. In “compromise” methods (G) only a few spectral ranges are measured and the FOV is limited, but the measurement is fast.

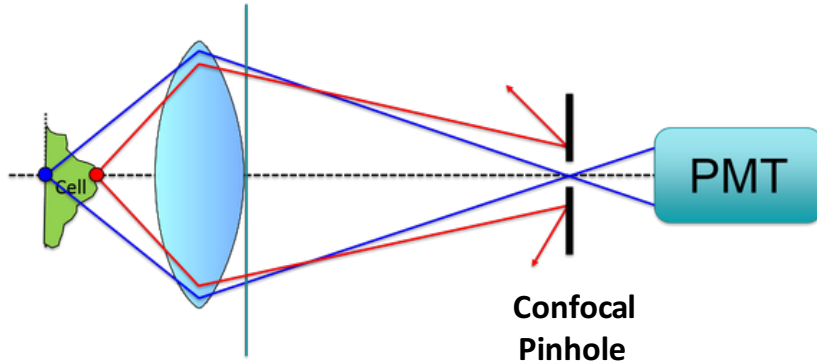
# Spectral imaging methods: Spatial-scan

- 3 Different ways used by microscope companies

Spatial Scan Spectral Imaging Configurations



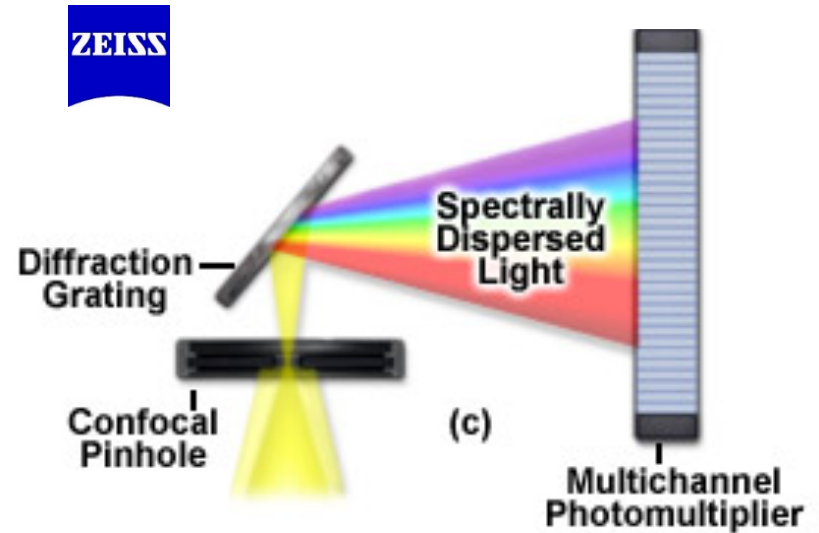
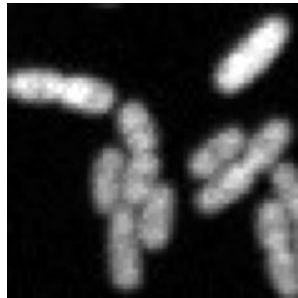
# Conventional vs spectral detection



1 Channel

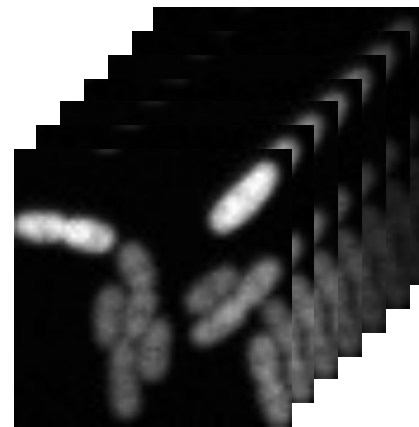
Sum of gated wavelengths

480:540nm =



32 Possible Channels

Each a portion of gated wavelengths



= 480nm

= 490nm

= 500nm

= 510nm

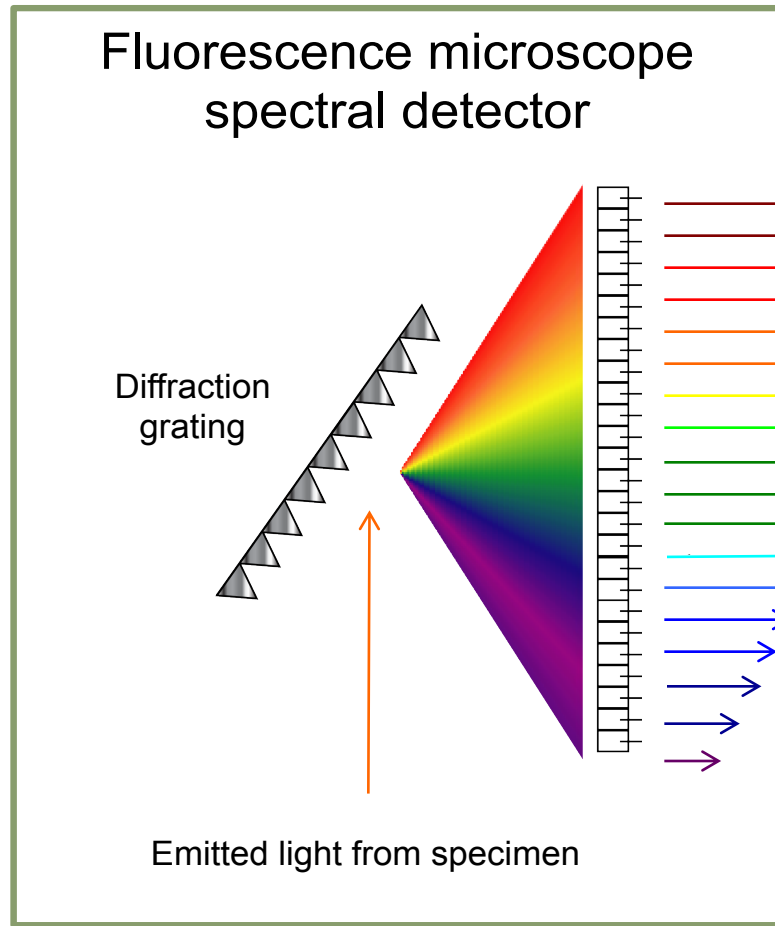
= 520nm

= 530nm

= 540nm

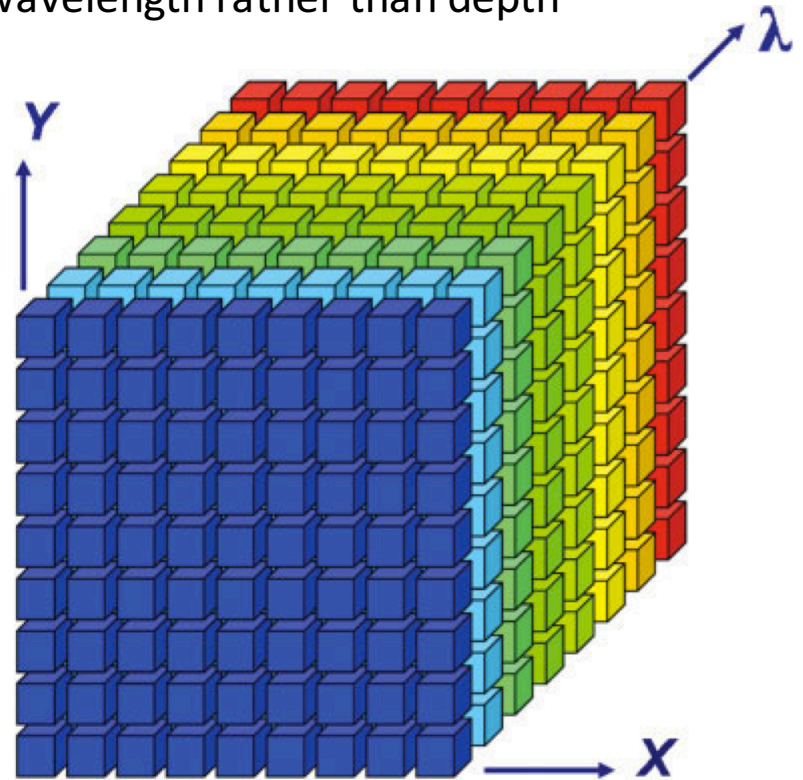
$\lambda$  stack

# Spectral detection



## Dataset: $\lambda$ stack

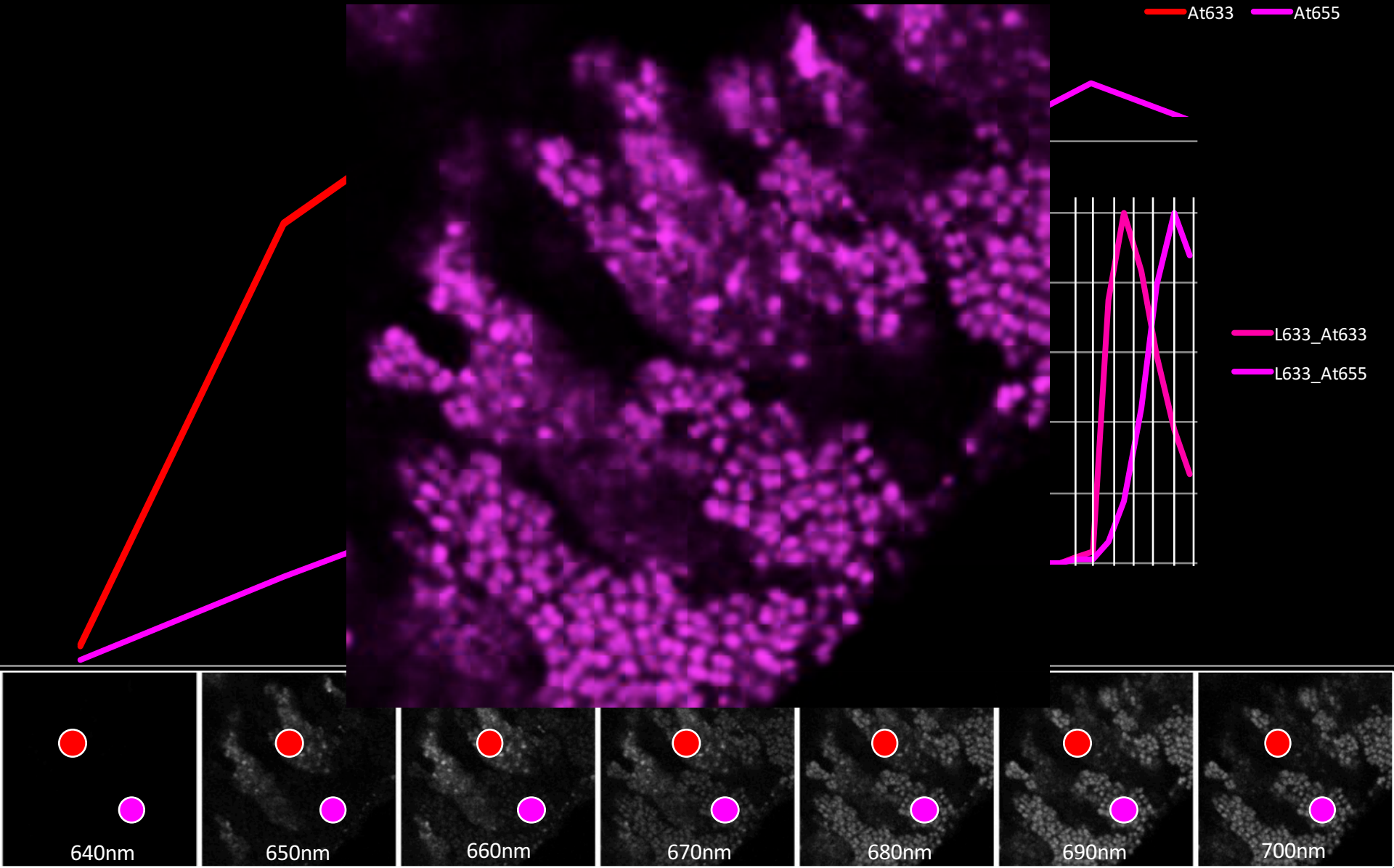
Like a Z-stack, but each slice represents wavelength rather than depth



Spectral Image Data Cube

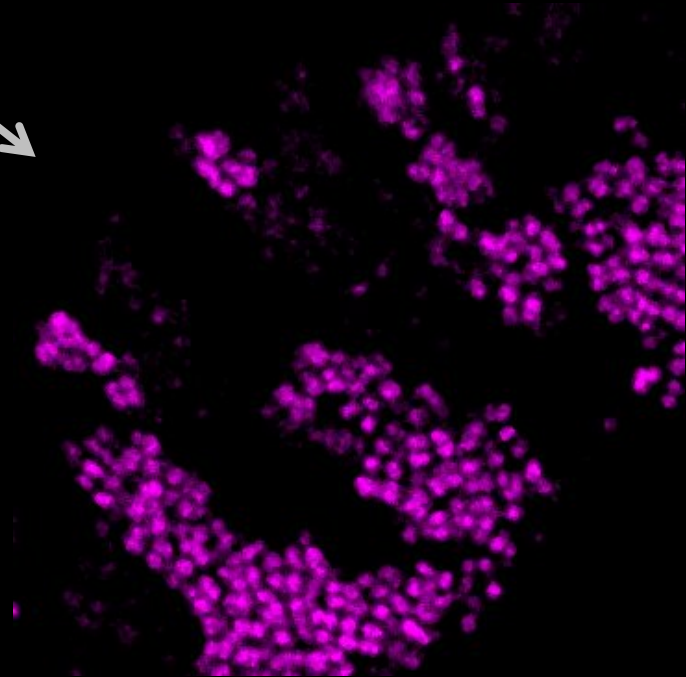
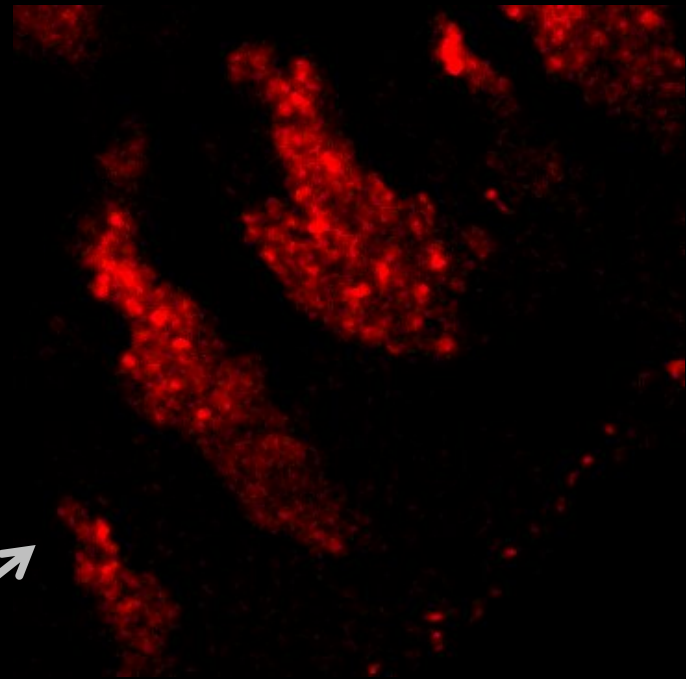
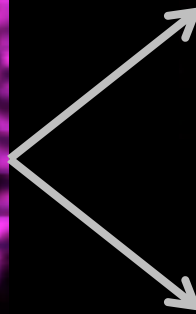
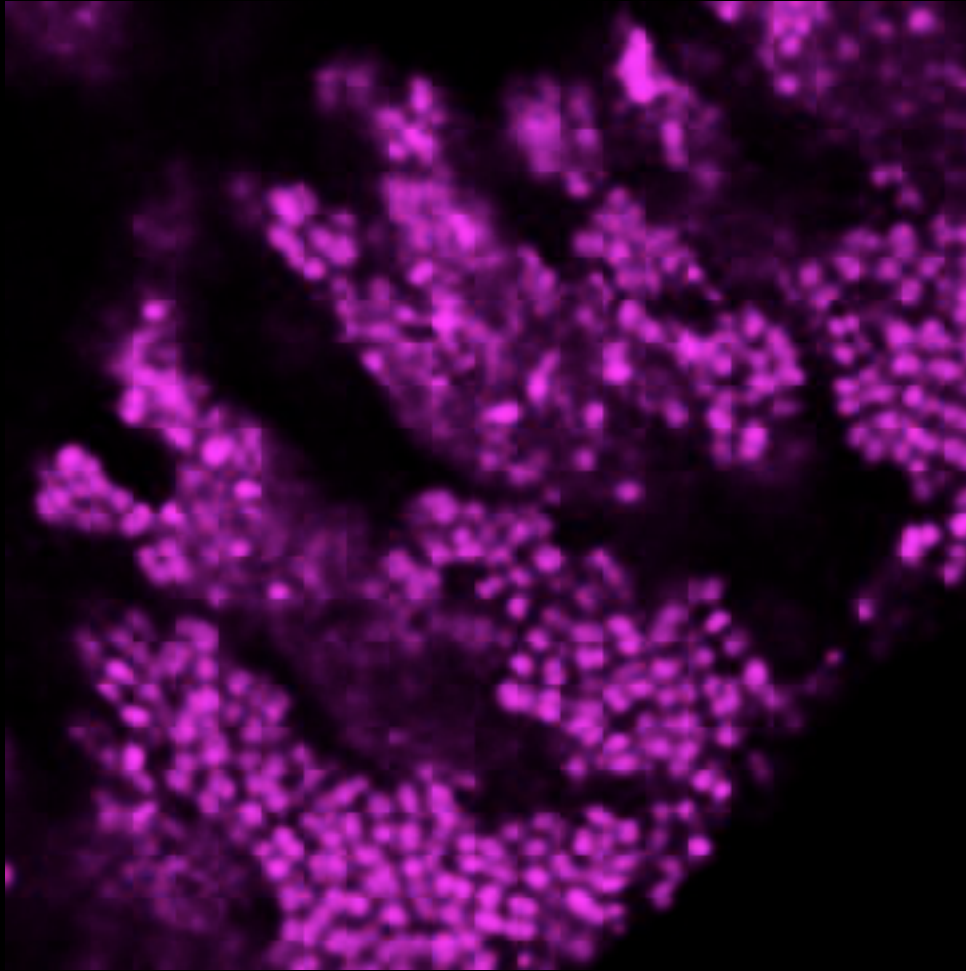
# Problem: Overlap

## Solution: Spectral Imaging





# Result: Spectral Unmixing



How do we unmix these  
datasets?



Input:  $\lambda$  stack

640nm

650nm

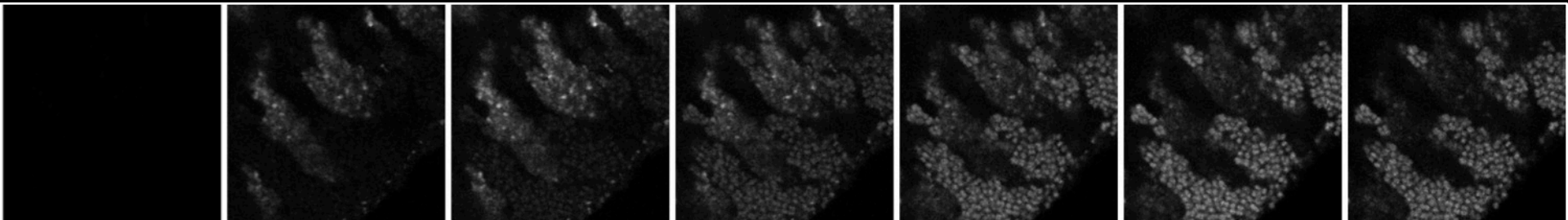
660nm

670nm

680nm

690nm

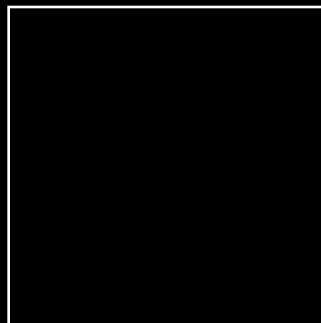
700nm



Output: unmixed images

Atto633

Atto655



# Linear unmixing

- We can make a formula where the summed pixel intensity across lambda (S) needs to be divided up into each reference output image (R1 and R2).

$$S(\lambda) = \%_1 * R1(\lambda) + \%_2 * R2(\lambda)$$

- We need to calculate these variables ( $\%_1$  and  $\%_2$ ) such that the intensity is CLOSEST to (least different from) the reference curves
- To be least different, we need to solve this formula for  $\%_1$  and  $\%_2$  so that we get the smallest value possible

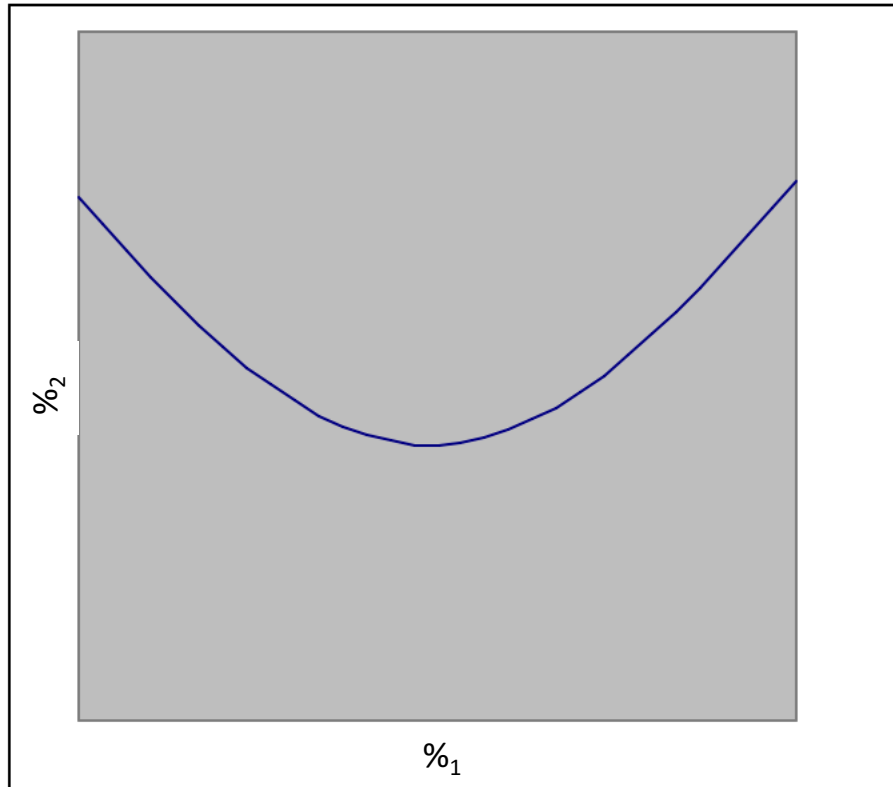
$$S(\lambda) - \%_1 * R1(\lambda) - \%_2 * R2(\lambda) = \text{minimum}$$

- Since we have multiple variables to solve for simultaneously, we need to use some fancy linear algebra and matrix math
- At its core, unmixing algorithms can perform a **least squares analysis** to test each possible % value to get this function to its minimum

$$S * [S(\lambda) - [\%_1 * R1(\lambda) + \%_2 * R2(\lambda)]]^2$$

# Least squares function

$$S*[S(\lambda) - [\%_1*R1(\lambda) + \%_2*R2(\lambda)]]^2$$



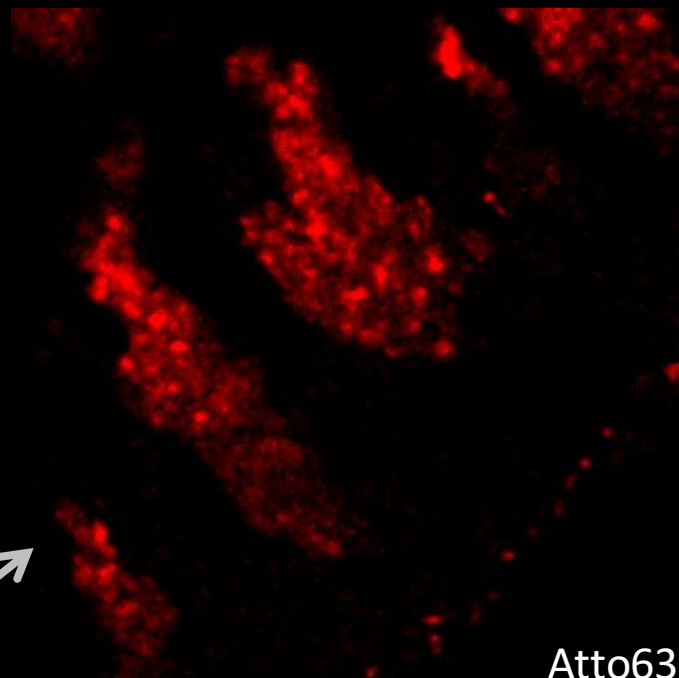
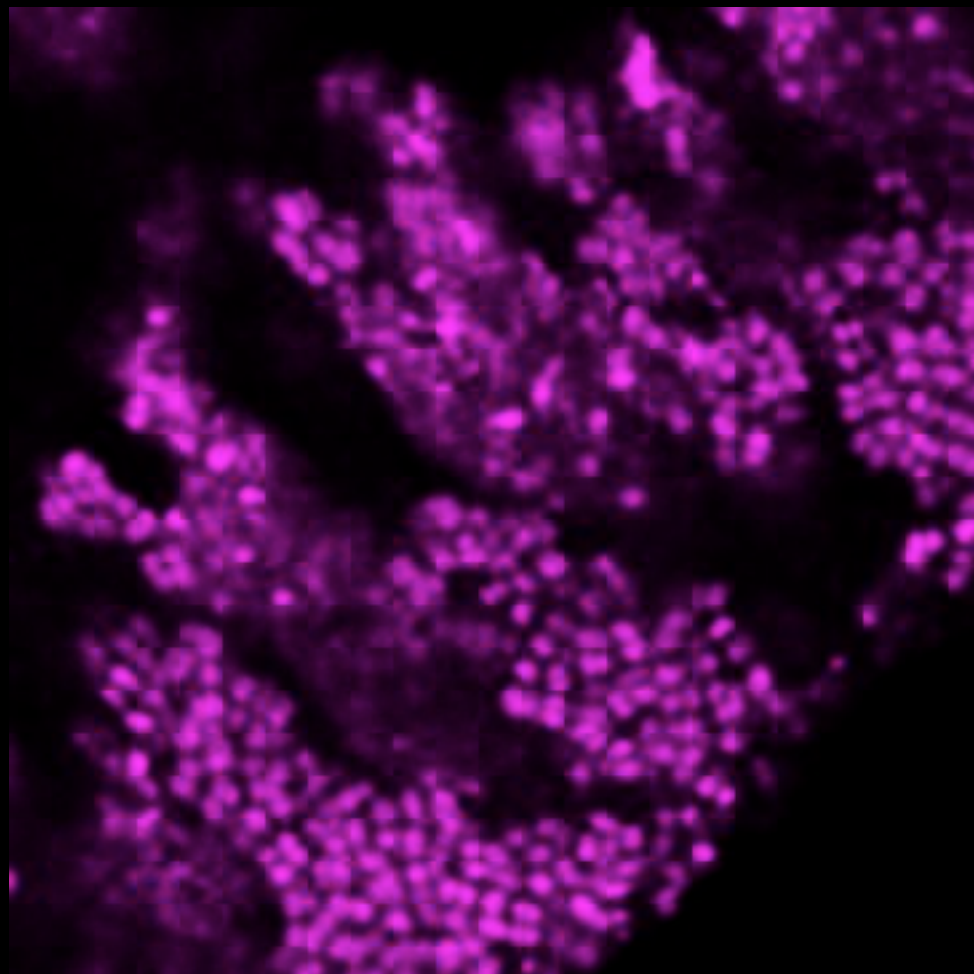
Compares the measured spectrum with all possible mixtures of reference spectra, and solves for the minimal difference between measured and reference spectra

Results:

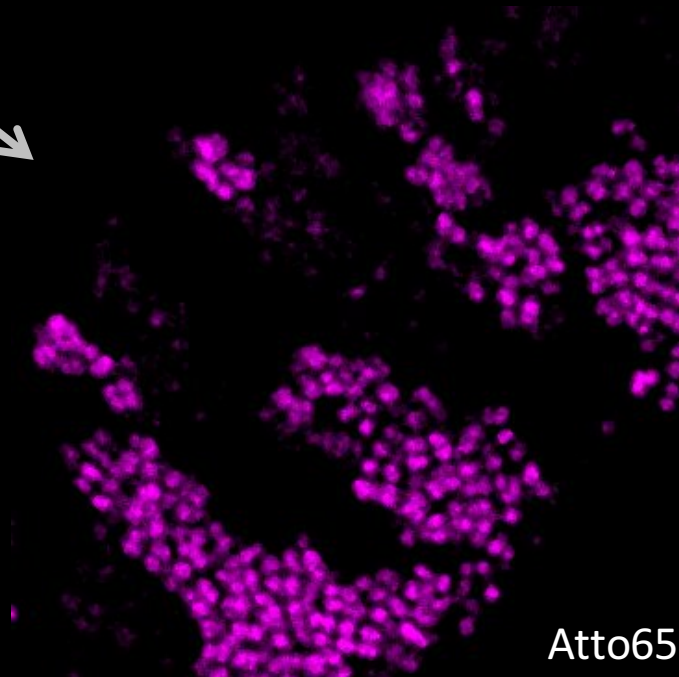
Values for %<sub>1</sub> and %<sub>2</sub> that tell you what proportion of your measured value belongs in each output file

Number of references must = number for fluorophores in the image.

```
parfor i = 1:N
    channels(:,i) = lsqnonneg(refSpectra, lambdaStack(:,i));
end
```



Atto633



Atto655

Input:  $\lambda$  stack

640nm

650nm

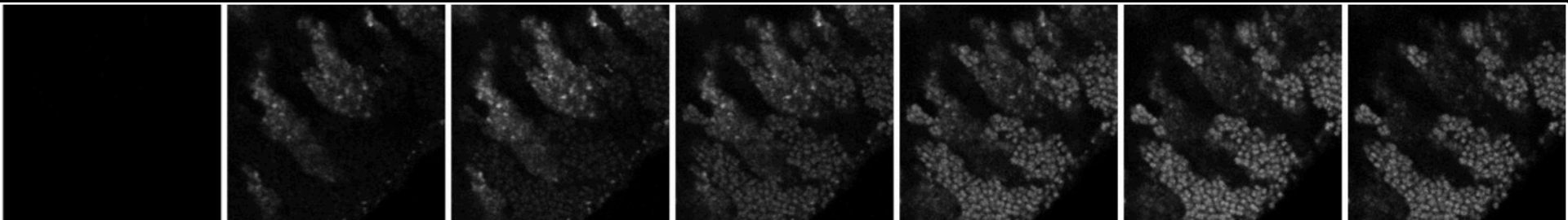
660nm

670nm

680nm

690nm

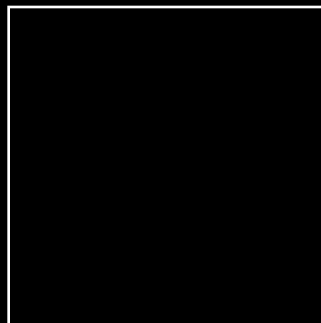
700nm



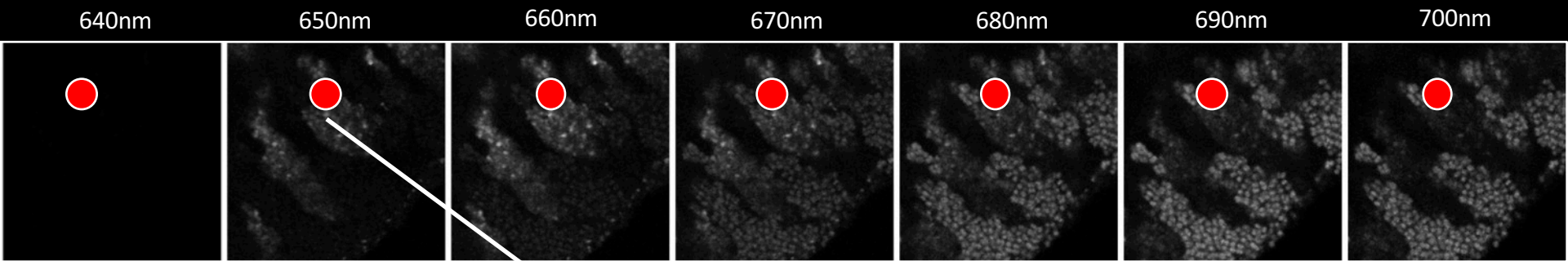
Output: unmixed images

Atto633

Atto655



Input:  $\lambda$  stack



Summed pixel gray value: 150

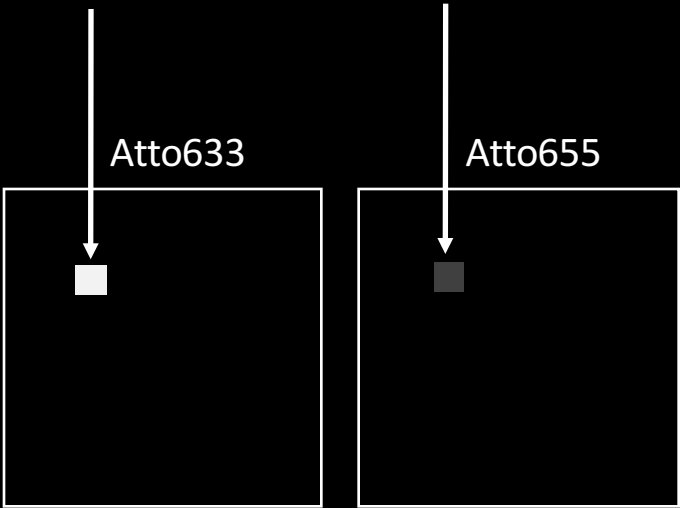
$$\%_1 = 0.90$$

$$\%_2 = 0.10$$

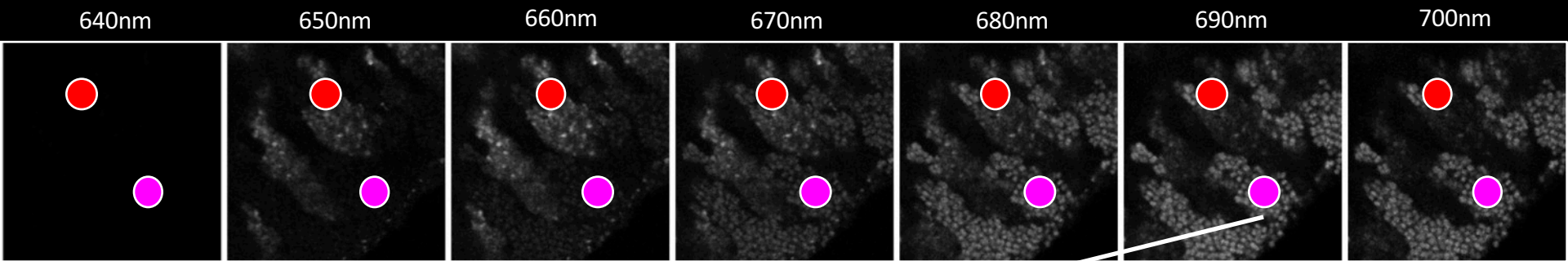
$$\text{Atto633} = 150 \times 0.90 = 135$$

$$\text{Atto655} = 150 \times 0.10 = 15$$

Output: unmixed images



Input:  $\lambda$  stack



Summed pixel gray value: 200

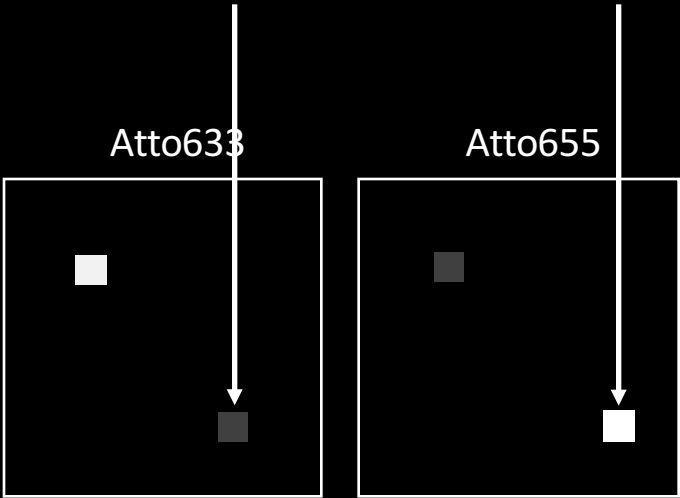
$$\%_1 = 0.05$$

$$\%_2 = 0.95$$

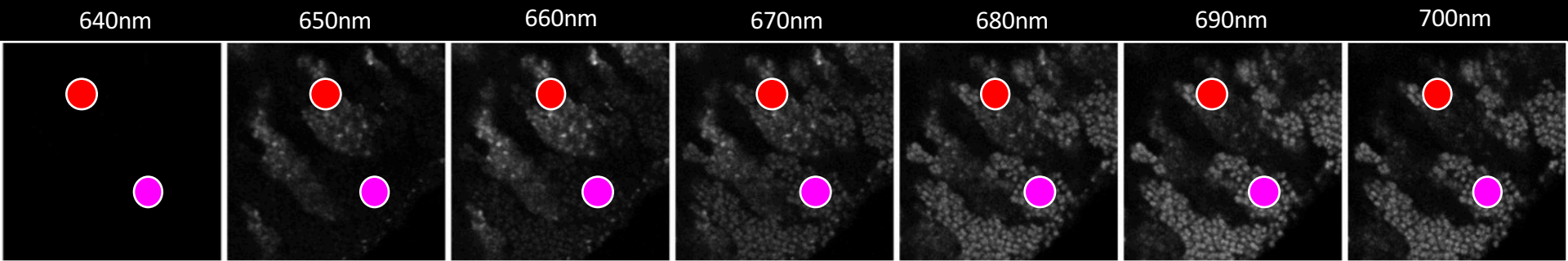
$$\text{Atto633} = 200 \times 0.05 = 10$$

$$\text{Atto655} = 200 \times 0.95 = 190$$

Output: unmixed images



Input:  $\lambda$  stack



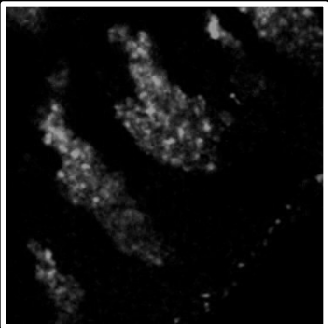
Over and over

and over

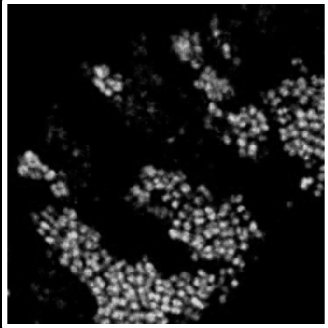
and over

Output: unmixed images

Atto633



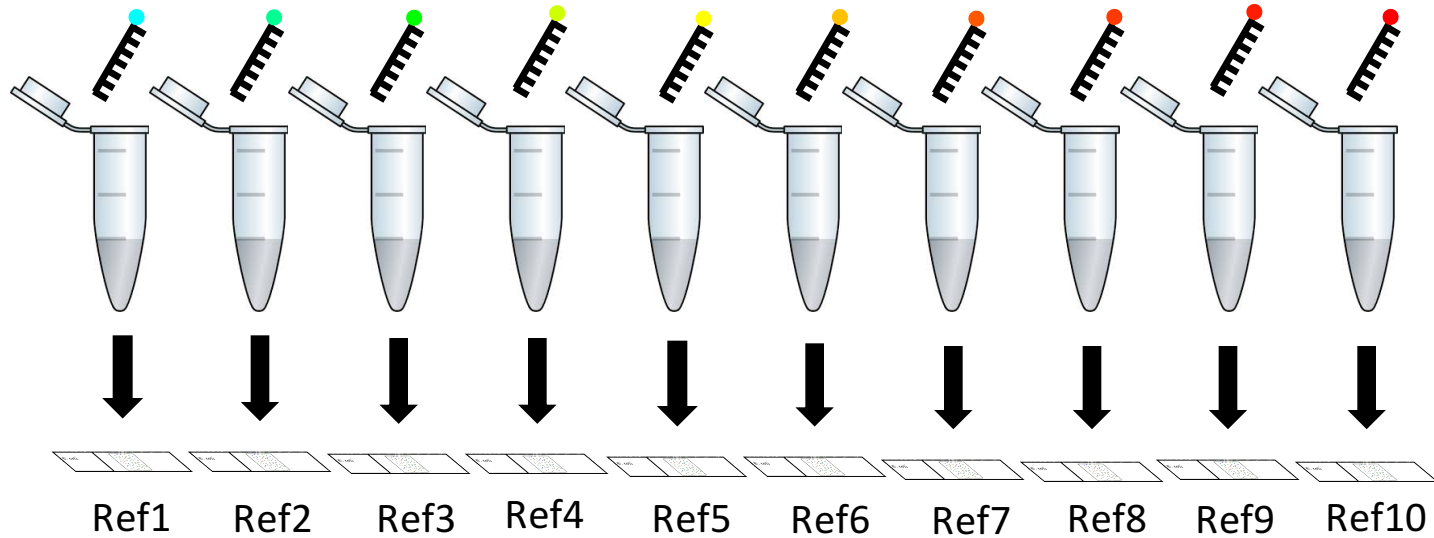
Atto655





# Test - Unmixing 10 fluorophores

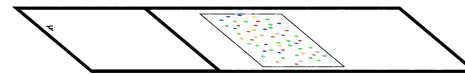
10 tubes *L. buccalis*  
10 Probes added

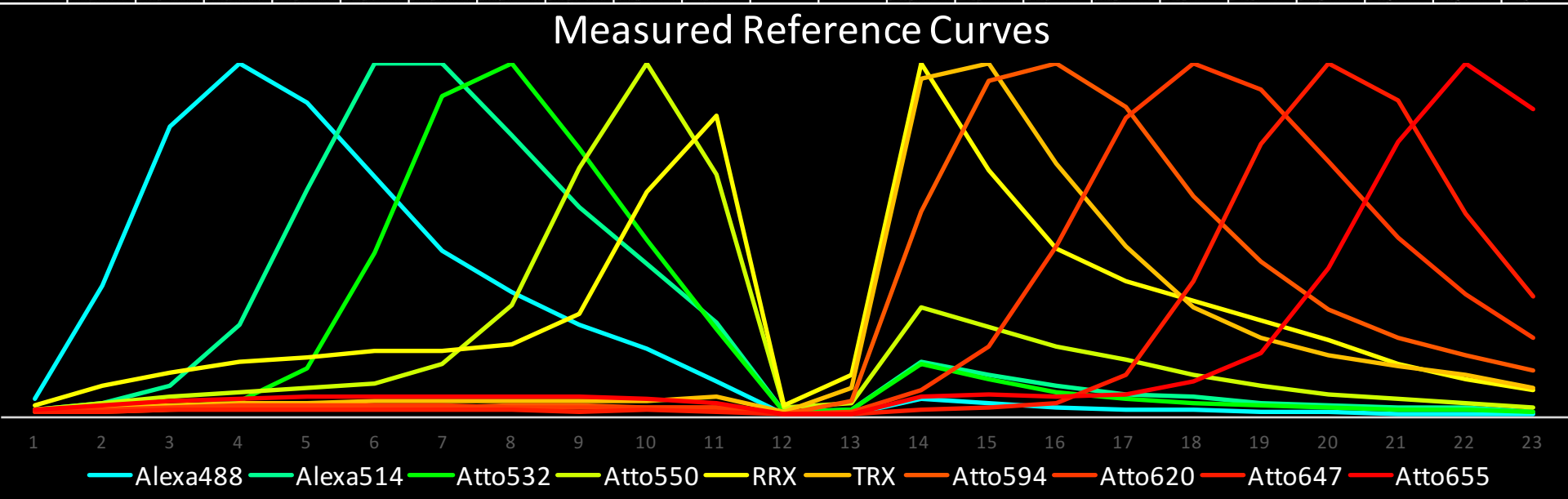
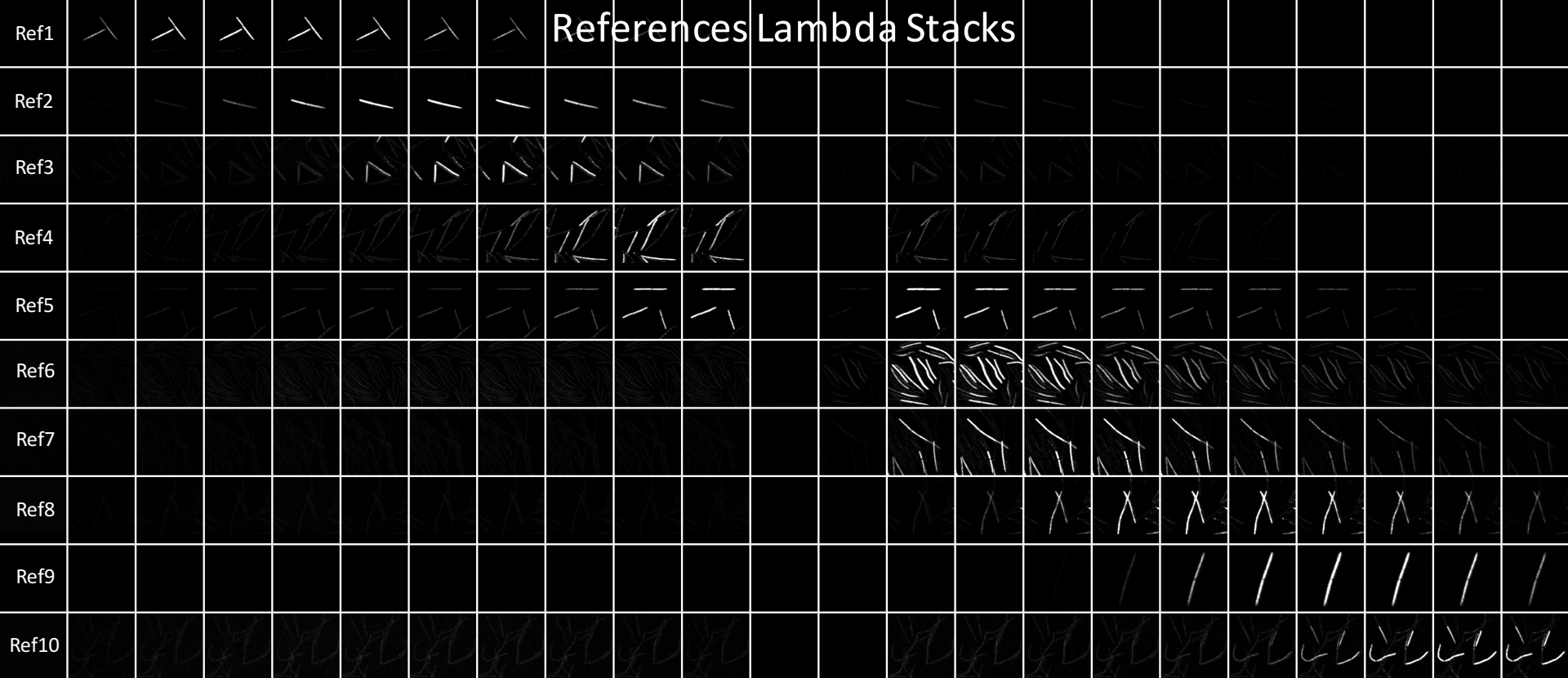


Mix labeled cells



Mix slide





# MIP

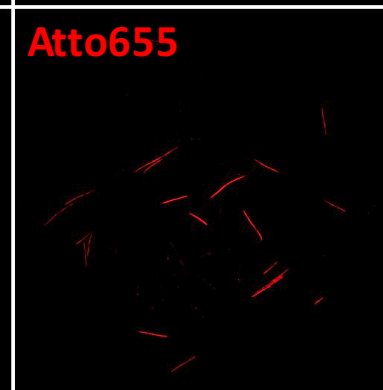
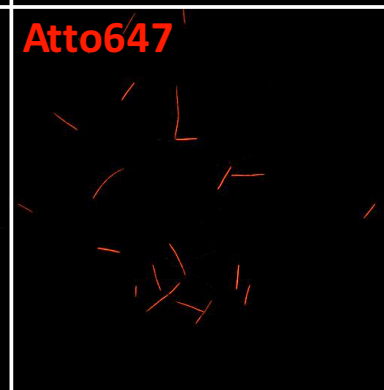
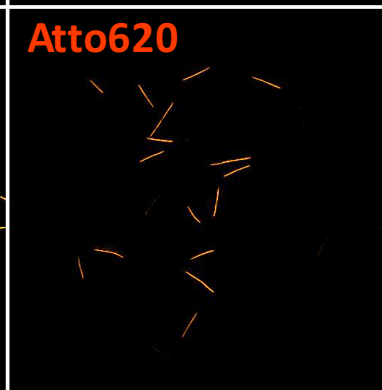
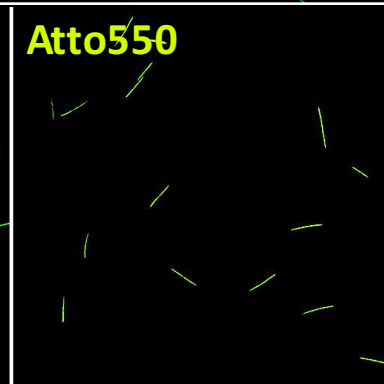
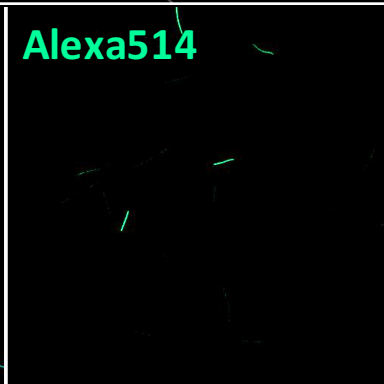
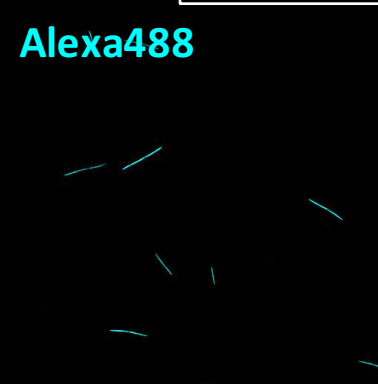
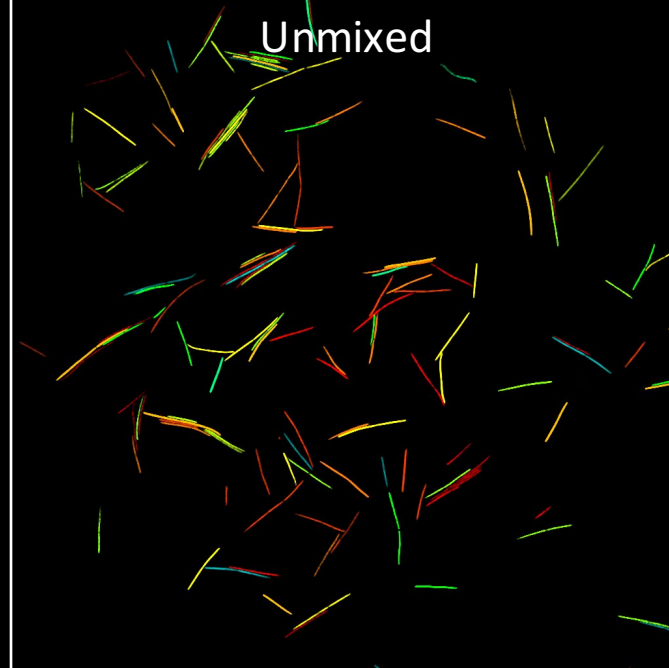
## Experimental Lambda Stack

\*Notice how  
there is not  
one image in  
the lambda  
stack where  
you can see  
only one cell  
population





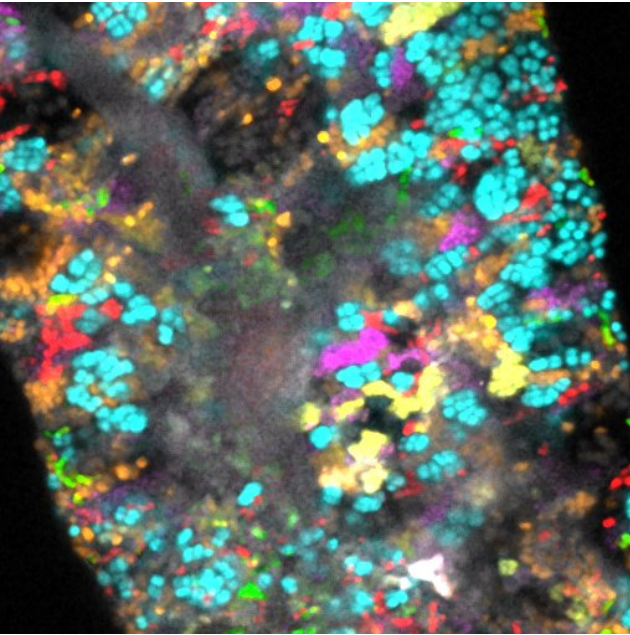
Unmix



Can we unmix more than  
fluorophore spectra?

# Removing Autofluorescence

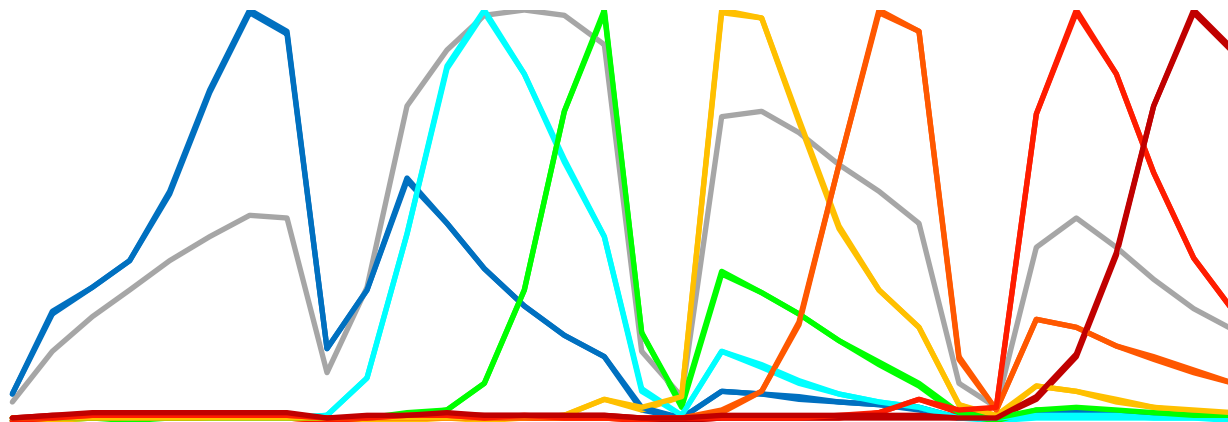
Unmixed channels + AF



AF



Unmixed Channels - AF

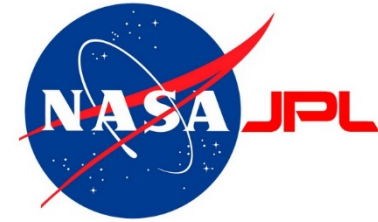


# Spectral Summary

1. Use spectrally separated fluorophores when you can, if not possible, spectral imaging and unmixing!
2. Methods: generating spectra by selectively imaging one wavelength at a time, or imaging a range of wavelengths simultaneously.
3. Can be used for separating highly overlapping spectra and removing unwanted autofluorescence.
4. Reference library for unmixing must equal number of fluorophores in sample.
5. Unmixing:  
**Input:** Lambda stack, references  
**Output:** One channel per reference, each containing a percent of it's contribution of original measured pixel.

# History of the Zeiss spectral detector

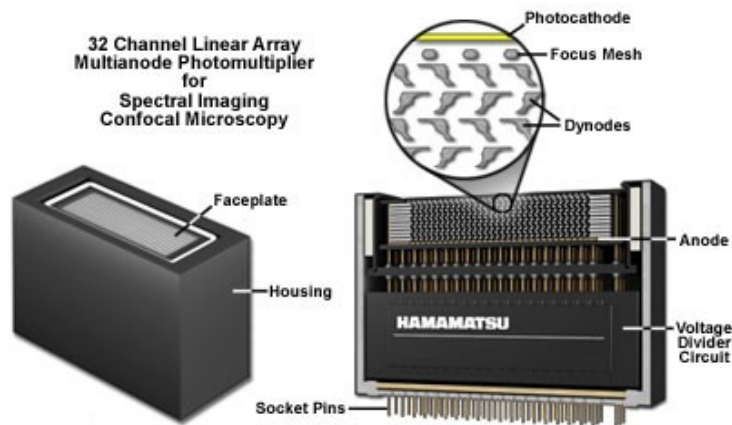
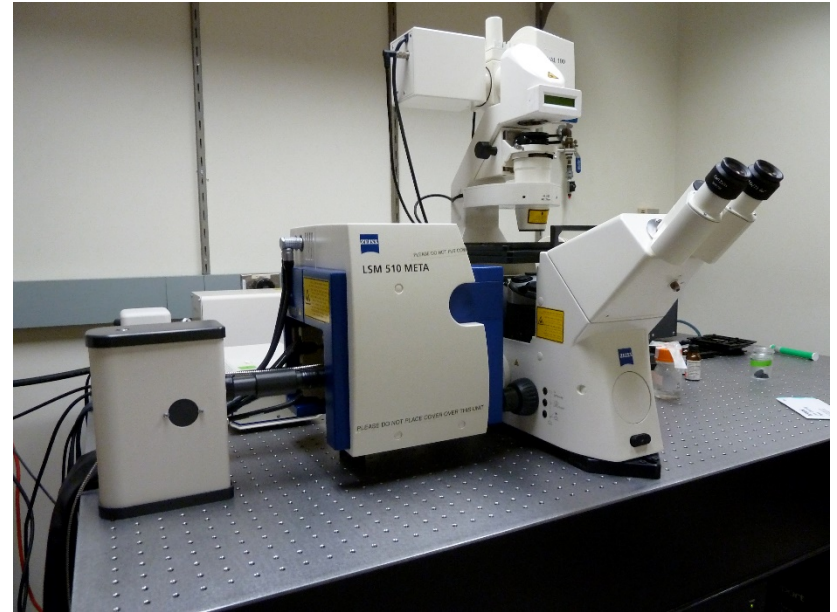
- Where did the idea of a multichannel detector come from?
- Collaboration between the Jet Propulsion Laboratory, Scott Fraser's lab here at Caltech and Zeiss





# History of the Zeiss spectral detector

- Zeiss META had 8 channel detector
- Replaced by 32 channel Quasar detector



# Learning More

## **Introduction to spectral imaging and linear unmixing**

<http://zeiss-campus.magnet.fsu.edu/articles/spectralimaging/introduction.html>

## **Interactive spectral unmixing tutorial**

<http://zeiss-campus.magnet.fsu.edu/tutorials/spectralimaging/linearunmixing/indexflash.html>

## **Spectral Database**

<http://www.spectra.arizona.edu/>