



# Image Segmentation

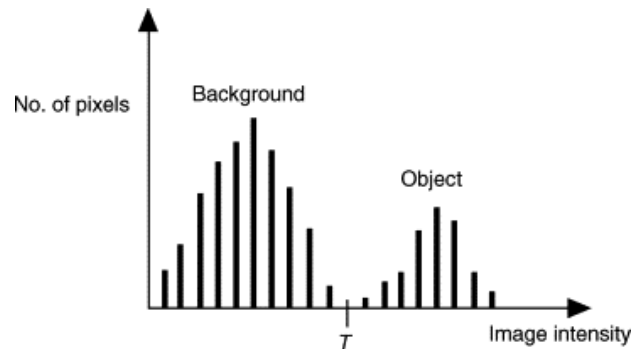
## Segmenting Multiple Objects

Scientific Visualization  
Professor Eric Shaffer

# Review: Segmentation by Thresholding

Classical thresholding results in a binary labeling

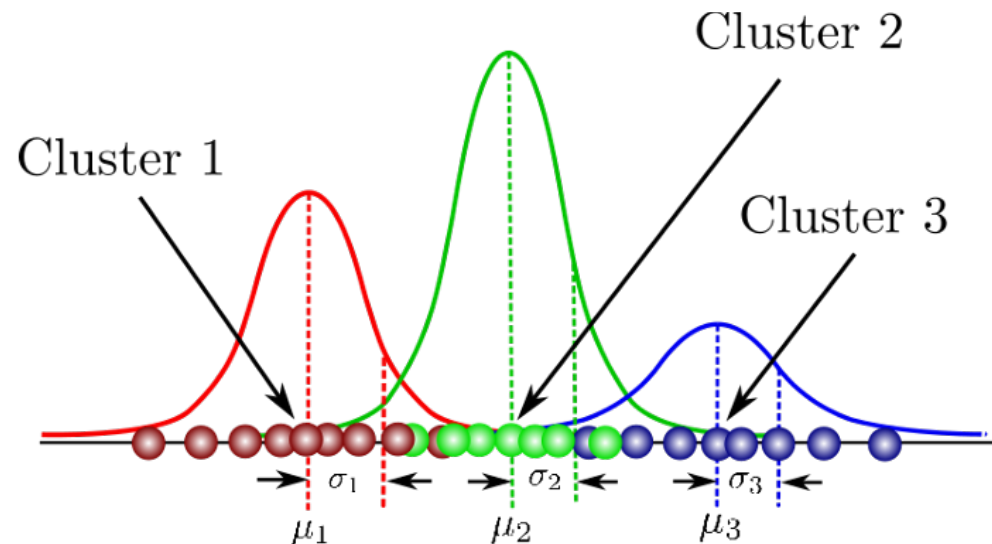
- Otsu's method
- Good approach for segmenting single object or all objects of given type
- Supports notion of object(s)/foreground vs. background
- Will not be effective distinguishing multiple objects



# Other Approaches to Thresholding

## Expectation Maximization (EM) to fit Gaussians

- More powerful and flexible than Otsu's method
- EM can infer the parameters of multiple Gaussian distributions
- Usually more computationally expensive
- You must separately compute the thresholds after the GMM has been inferred
  - GMM is Gaussian mixture model
- General EM of GMM can easily model multiple classes of pixels



# Thresholding with Non-Binary Labels

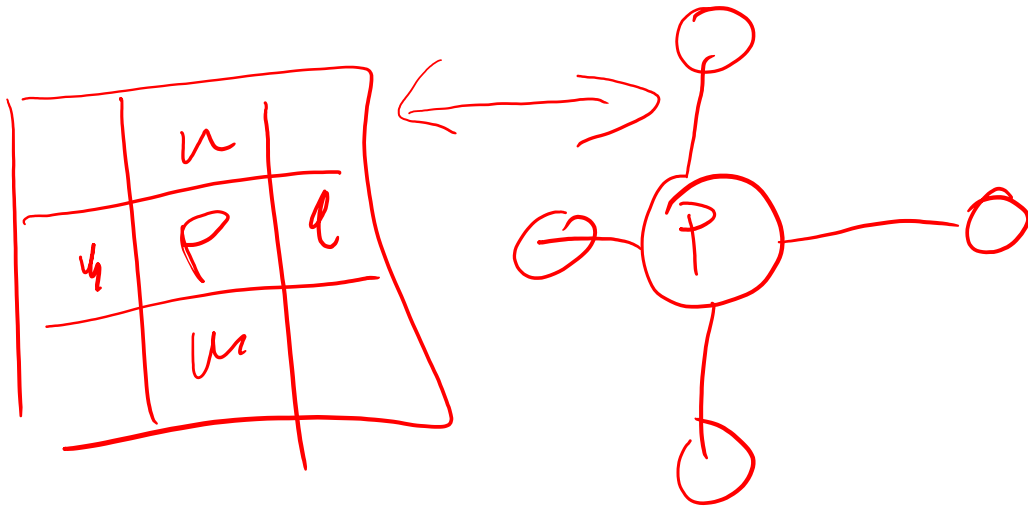
- Recall that thresholding produces a binary segmentation
- What if thresholding detects multiple objects  
...but we need to analyze each of them separately?
  - e.g. multiple bones in a CT scan
  - Multiple fiducial markers.
- We need to give a different label to each detected object

# Graph-Theoretic Image Segmentation

Can use a graph-theoretic approach to extend binary thresholding

Connected component analysis lets us:

- Assign a different label to each (disconnected) object...
- from the (binary) set of segmented objects



1	1	1	1	1	1	1	1	1	1	1	1
1	1	1	1	1	1	1	1	1	1	1	1
1	1	2	2	1	1	1	1	2	2	2	2
1	1	2	2	1	1	1	1	2	2	2	2
1	1	2	2	1	1	1	1	2	2	2	2
1	1	2	2	1	1	1	1	2	2	2	2
1	2	2	2	2	1	1	1	2	2	1	1
1	2	1	1	2	1	1	1	2	2	1	1
1	2	1	1	2	1	1	1	2	2	1	1
1	2	2	2	2	1	1	1	2	2	1	1
1	1	1	1	1	1	1	1	1	1	1	1
1	1	1	1	1	1	1	1	1	1	1	1

Thresholding

1	1	1	1	1	1	1	1	1	1	1	1
1	1	1	1	1	1	1	1	1	1	1	1
1	1	2	2	1	1	1	1	3	3	3	3
1	1	2	2	1	1	1	1	3	3	3	3
1	1	2	2	1	1	1	1	3	3	3	3
1	1	2	2	1	1	1	1	3	3	3	3
1	2	2	2	2	1	1	1	3	3	1	1
1	2	1	1	2	1	1	1	3	3	1	1
1	2	1	1	2	1	1	1	3	3	1	1
1	2	2	2	2	1	1	1	3	3	1	1
1	1	1	1	1	1	1	1	1	1	1	1
1	1	1	1	1	1	1	1	1	1	1	1

Thresholding  
+  
Connected  
Component  
Analysis



# Recursive Region Growing

One method of doing connected component analysis

## Algorithm

Input: A threshold segmentation with object pixels as black in  $f$

1. Search for an unlabeled black pixel; that is,  $L(x, y) = 0$   
If you find one, choose a new label number for this region, call it  $N$   
If all pixels have been labeled, stop
2.  $L(x, y) \leftarrow N$
3. Push unlabeled neighboring object pixels onto the stack
  - If  $f(x-1, y)$  is black push  $(x-1, y)$  onto the stack.
  - If  $f(x+1, y)$  is black push  $(x+1, y)$  onto the stack.
  - If  $f(x, y-1)$  is black push  $(x, y-1)$  onto the stack.
  - If  $f(x, y+1)$  is black push  $(x, y+1)$  onto the stack.
4. If the stack is empty, go to 1
5. Else choose a new  $(x, y)$  by popping the stack and go to 2.

$\gamma = \emptyset, 1, 0, 1, 2$

0	4	0 ⊕	0 ⊕
1		4	0 ⊕
2	1 ⊕		

$(1, 2)$   
 $(0, 2)$

