

# Introduction to Medical Imaging

(5XSA0)

## Image Segmentation

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# This chapter: Segmentation

- \* Subdivide images into regions or objects
- \* What a “region” or object is, is usually application-dependent
- \* The problem is often the absence of a ground truth
- \* Also: when to stop segmenting?

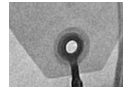
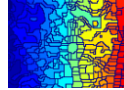


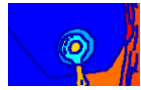
Image of ECG pad



Oversegmentation



Undersegmentation



“Good” segmentation



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# Segmentation: Basic approaches

- \* “Top-down”: based on *discontinuity*
  - Pixels belonging to different objects will have different gray values
  - Partition an image based e.g. on edges
- \* “Bottom-up”: based on *similarity*
  - Pixels belonging to the same object will have similar gray values
  - Partition an image based on similarity criterion



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# What we will see today

Implementations, using MATLAB, of the following techniques:

- \* Point and line detection for segmentation
- \* Thresholding
- \* Region-based segmentation
- \* Watershed transform



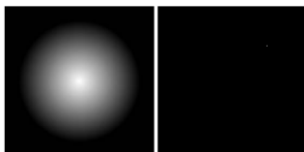
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# Point detection

- \* Look for a point that is different from its neighborhood
- \* Apply an isolating mask to calculate:  
$$R = w_1 z_1 + w_2 z_2 + \dots + w_9 z_9$$
- \* A point is detected at the center of the mask if  
 $|R| \geq T$  where  $T$  is a threshold



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# Line detection

- \* Masks responding to lines of different orientations:

-1	-1	-1	-1	2	-1	2	-1	-1
2	2	2	-1	2	-1	-1	2	-1
-1	-1	-1	2	-1	-1	-1	2	-1

Horizontal

+45°

Vertical

-45°

-45° detector (zoomed)

absolute values of -45° detector

Original image



-45° detector



Thresholded absolute values of -45° detector



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## Point and line detection in MATLAB 7

```
g = abs( imfilter (double(f), w ) ) >=T;
```

Binary image giving point locations

2D filtering

Input image

Threshold

Convert to double!

Mask

- \* How to set T?
- \* In a first instance, by examining the values of the feature image
- \* More on thresholding later

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## Thresholding 8

- \* Simple and computationally efficient
- \* Threshold selection uses intensity information  
→ histogram
- \* Example: bimodal histogram

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## Optimal Thresholding 9

- \* What value of T will give us the best segmentation?
- \* Gonzalez and Woods:
  - Initialize T (e.g. halfway between min and max)
  - Iteratively set  $T = 0.5 * (\mu_1 + \mu_2)$ , where  $\mu_1, \mu_2$  the mean values of pixels with value larger or smaller than T, respectively
  - Until T converges

Iteration 1

Iteration 2

Iteration 3

Iteration 4

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## Region Growing 10

- \* Start from a seed point, selected manually or automatically
  - Several seed points are also possible
- \* Include new neighboring points in the region based on some similarity criterion

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## Region Growing in MATLAB 11

- \* Function (from textbook, *not* Image Processing Toolbox):  
`[g, NR, SI, TI] = regiongrow(f, S, T);`
- \* Input:
  - **f** : image
  - **S** : seed points (scalar → all points with this value, array → 1's for seed points and 0's for non-seed points)
  - **T** : threshold (scalar → global threshold, array → local threshold at each point)
- \* Output:
  - **g** : segmentation result (different labels per region)
  - **NR** : # of regions
  - **SI** : final seed image
  - **TI** : image of pixels that passed threshold test

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## Region Growing in MATLAB 12

- \* Play with seed points & thresholds

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## References

- Rafael C. Gonzalez, Richard E. Woods, Steven L. Eddins,  
“Digital Image Processing Using Matlab”,  
Pearson Education, 2004  
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