

## Outline

- Image Representation and Description
  - Boundary representations: Chain codes, polygonal approximations, signatures, and skeletons
  - Boundary descriptors: Basic descriptors, Fourier descriptors, statistical moments

## Boundary Representations: Chain Codes

- We can describe a boundary by starting from a point and forming a vector with directions for each pixel using 4 or 8 connectivity
- The disadvantages of this direct implementation is that, the chain can be very long and not robust to noise
- Therefore, we usually use larger grids than pixels
- In this way, both robustness is increased and the chain is shorter

## Boundary Representations: Chain Codes (Cont.)

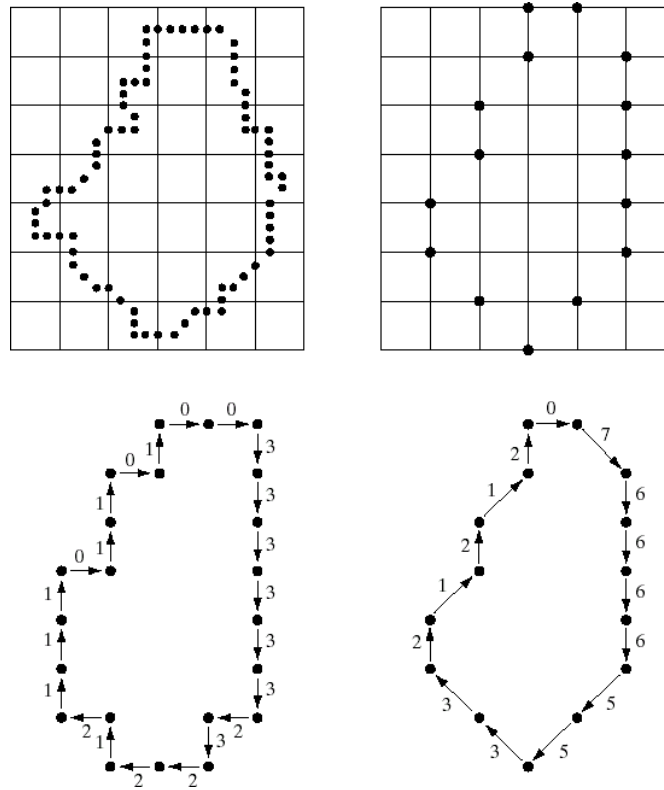


Illustration of a chain code

## Boundary Representations: Polygonal Approximations

- The goal is to find polygons that approximates the shape of the boundary
- Large number of polygons have a more accurate representation but it is time consuming to find these
- Small number of polygons catch only the basic information of the boundary (less accurate), but it is easier to find these
- Now let us have a look at a few methods to find these polygons

## Boundary Representations: Polygonal Approximations - Minimum perimeter polygons

- In this case we force the boundary to have the minimum length by keeping it in the same pixel

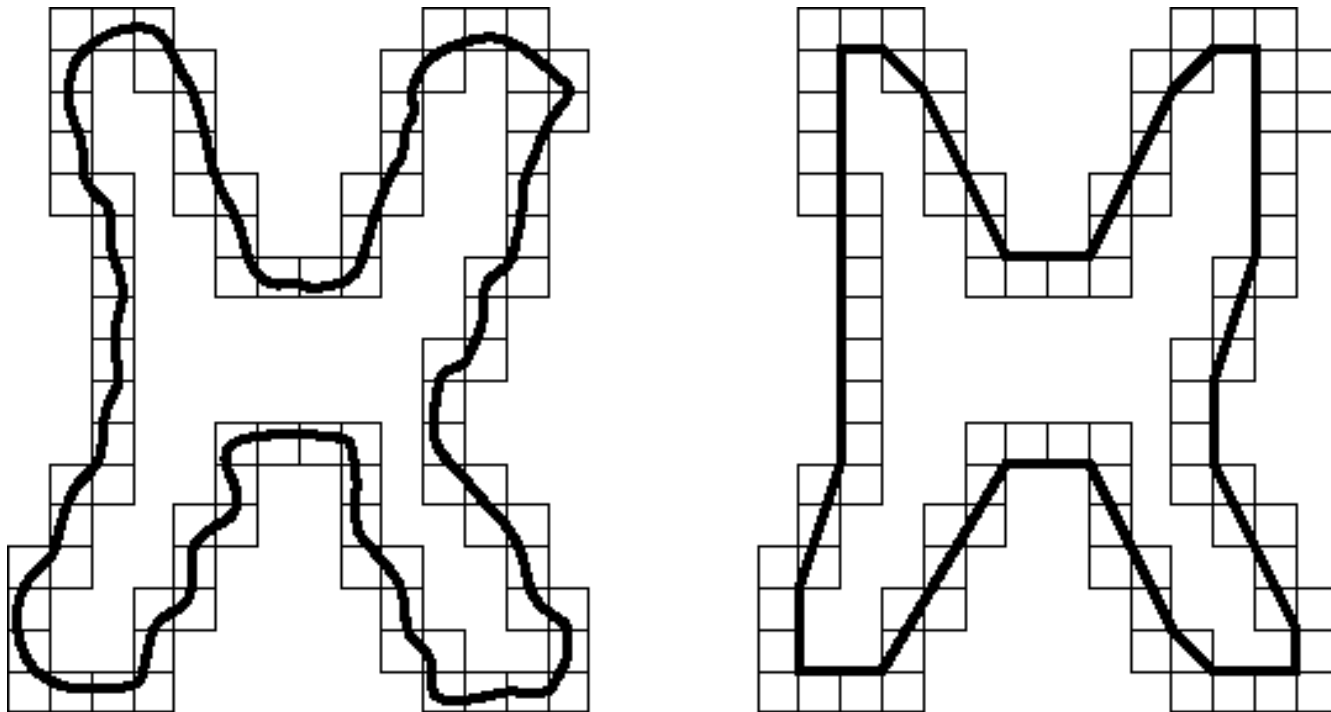


Illustration of a minimum parameter polygon

## Boundary Representations: Polygonal Approximations - Merging and Splitting

- Merging: We go through each of the boundary pixels, and merge them as long as the error between the representation and the real boundary is less than a threshold
- Splitting: We split the original boundary into two parts until a certain criterion is satisfied, such as the distance between the representation segment and the original boundary being less than a certain value

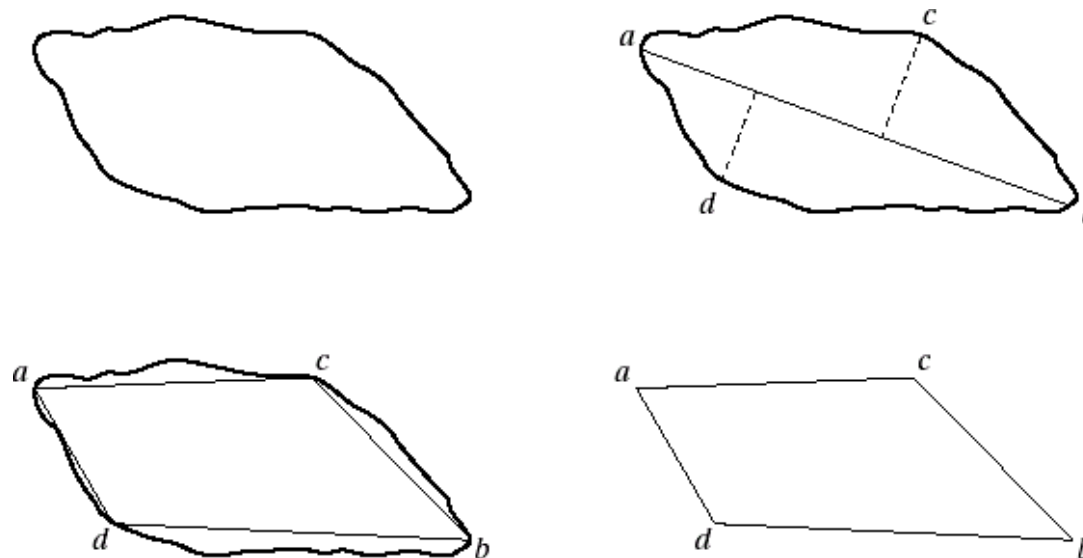


Illustration of splitting

## Boundary Representations: Signatures

- Signatures are 1-D representations of 2-D boundaries
- One straightforward way to obtain is to form a 1-D function which corresponds to the distance of the boundary pixel to its centroid

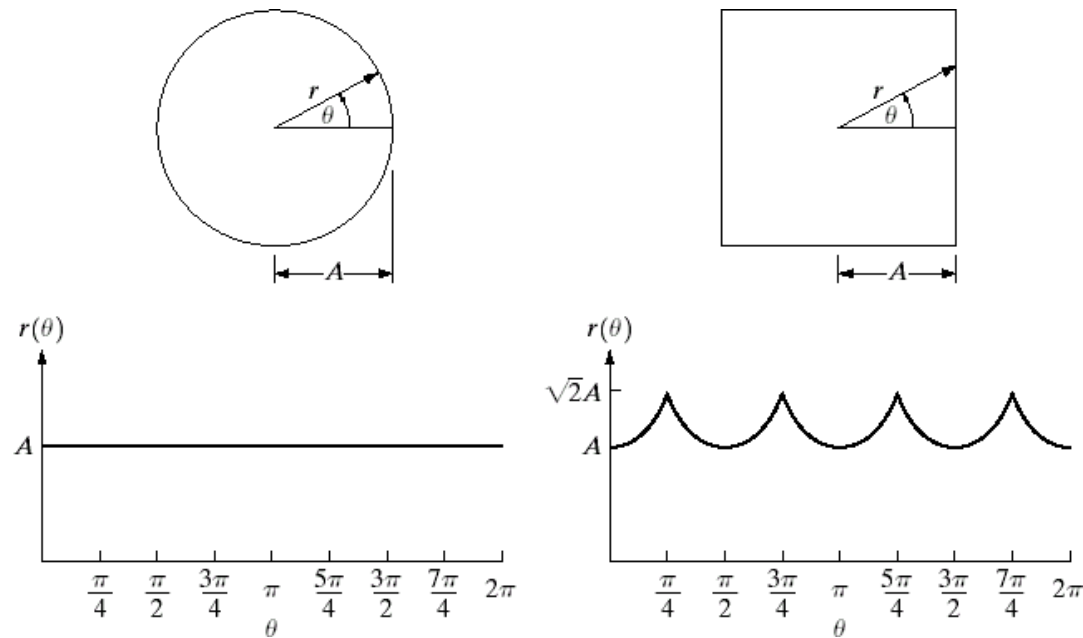


Illustration of signature

## Boundary Representations: Signatures (Cont.)

- Signatures obtained in this way are variant to rotation and scaling
- We can however obtain the same signature regardless of the orientation of the shape if we start from a point which is unique in the boundary (such as its distance from the center)
- Scaling basically just changes the amplitude of the shape, so we can obtain same signature by mapping the amplitude range of the signature to a fixed interval



## Boundary Representations: Skeletons

- We can form a skeleton as described earlier, however skeletons are not guaranteed to be connected
- We define another form of skeleton called the medial axis transformation (MAT) of a region
- MAT of a region  $R$  with border  $B$  is formed by all points in  $R$  that has more than one closest point on  $B$

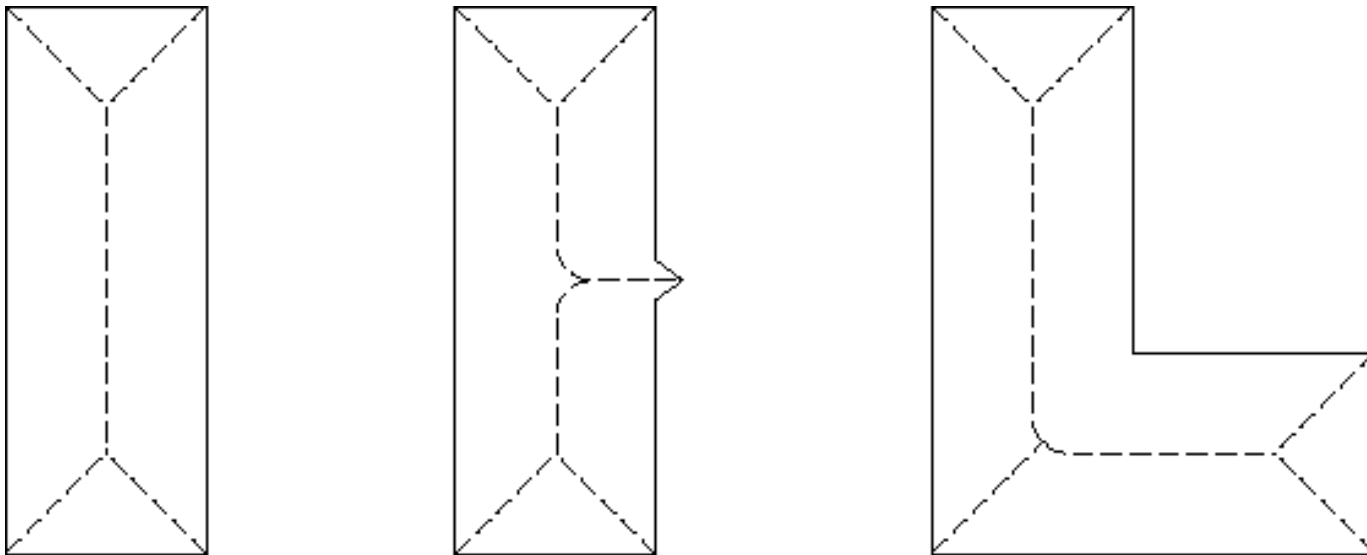


Illustration of MAT

## Boundary Descriptors: Basic Descriptors

- Length: we can calculate the length of a boundary by adding number of pixels with the horizontal and vertical directions and  $\sqrt{2}$  times the diagonal directions
- Diameter: the diameter of a boundar is defined as the maximum of the distance between all points on boundary

$$\text{Diam}[B] = \max_{i,j} [D(p_i, p_j)]$$

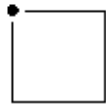
- Major and minor axis: Major axis is the line that connects the diameter points, and minor axis is the axis perpendicular to the major axis
- Eccentricity: ratio of the length of major and minor axes
- Curvature: rate of change of slope

## Boundary Descriptors: Shape Numbers

- Chain code representations depend on the starting pixel
- We can remove this problem if we choose the pixel that results in a chain code that is minimum when viewed as an integer number
- Difference of a chain code is defined as simply the difference between the successive chain code elements in a circular fashion and in mod 4 or mod 8 depending on the connectivity used
- Shape number is the shifted version of the difference code so that it has the smallest value possible when viewed as an integer

## Boundary Descriptors: Shape Numbers (Cont.)

Order 4

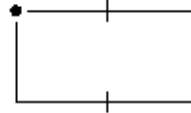


Chain code: 0 3 2 1

Difference: 3 3 3 3

Shape no.: 3 3 3 3

Order 6

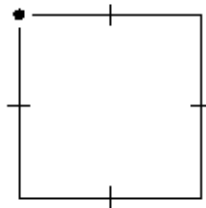


Chain code: 0 0 3 2 2 1

Difference: 3 0 3 3 0 3

Shape no.: 0 3 3 0 3 3

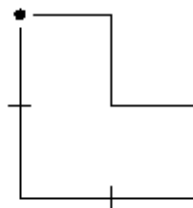
Order 8



Chain code: 0 0 3 3 2 2 1 1

Difference: 3 0 3 0 3 0 3 0

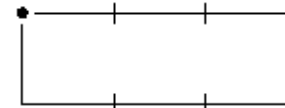
Shape no.: 0 3 0 3 0 3 0 3



Chain code: 0 3 0 3 2 2 1 1

Difference: 3 3 1 3 3 0 3 0

Shape no.: 0 3 0 3 3 1 3 3



Chain code: 0 0 0 3 2 2 2 1

Difference: 3 0 0 3 3 0 0 3

Shape no.: 0 0 3 3 0 0 3 3

Illustration of shape numbers

## Boundary Descriptors: Fourier Descriptors

- Now consider the pairs ( $x$  and  $y$  coordinates) of points that form a boundary
- Let us define a complex number  $s(k)$

$$s(k) = x(k) + jy(k)$$

- The Fourier transform of this series is called the Fourier descriptor of the boundary

$$a(u) = \frac{1}{K} \sum_{k=0}^{K-1} s(k) e^{-j2\pi uk/K}$$

- The boundary can be obtained from its Fourier descriptor as follows

$$s(k) = \sum_{u=0}^{K-1} a(u) e^{j2\pi uk/K}$$

## Boundary Descriptors: Fourier Descriptors (Cont.)

- If we truncate the summation, we just keep the low pass components of the boundary resulting in a more smooth boundary

$$s'(k) = \sum_{u=0}^{P-1} a(u) e^{j2\pi uk/K}$$

where  $P < K$

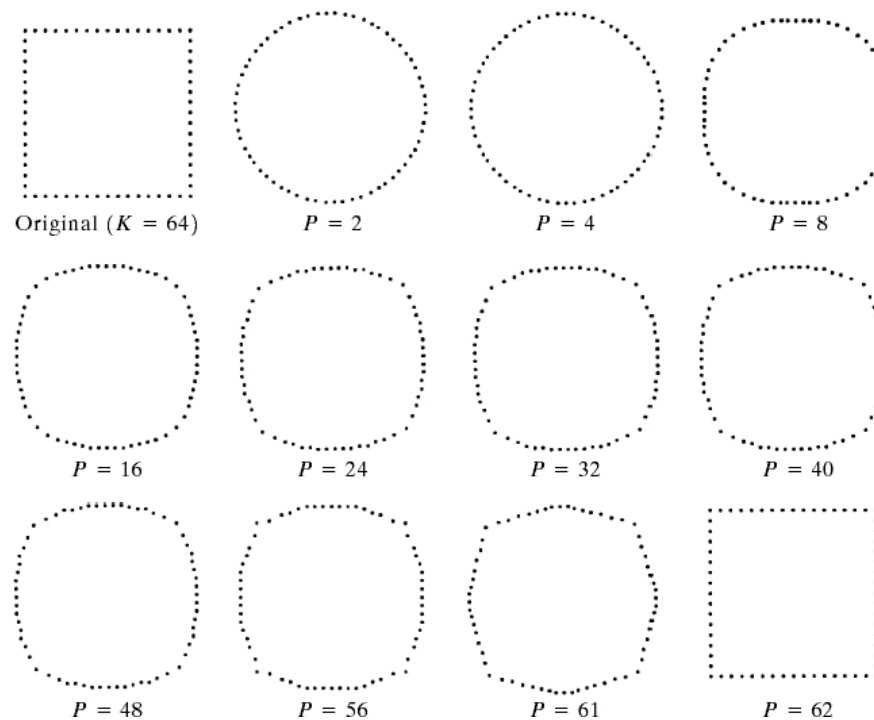


Illustration of truncation

## Boundary Descriptors: Fourier Descriptors (Cont.)

- Although Fourier descriptors are not invariant to certain changes in the boundary such as scaling rotation etc, these operations have simple corresponding changes in its Fourier descriptor

Transformation	Boundary	Fourier Descriptor
Identity	$s(k)$	$a(u)$
Rotation	$s_r(k) = s(k)e^{j\theta}$	$a_r(u) = a(u)e^{j\theta}$
Translation	$s_t(k) = s(k) + \Delta_{xy}$	$a_t(u) = a(u) + \Delta_{xy}\delta(u)$
Scaling	$s_s(k) = \alpha s(k)$	$a_s(u) = \alpha a(u)$
Starting point	$s_p(k) = s(k - k_0)$	$a_p(u) = a(u)e^{-j2\pi k_0 u/K}$

Illustration of shape numbers

## Boundary Descriptors: Statistical Moments

- After obtaining a 1-D representation of a boundary, we can treat this 1-D function as a PDF, and calculate the moments
- These moments can be used as the descriptors
- Let  $g(r)$  represent the 1-D function, and  $p(v_i)$  the PDF of its amplitude
- The mean is then

$$m(v) = \sum_{i=0}^{A-1} (v_i)p(v_i)$$

- The more general  $n$ th order moment about its mean is defined as

$$\mu_n(v) = \sum_{i=0}^{A-1} (v_i - m)^n p(v_i)$$