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## CHAPTER 1: Introduction

The word morphology refers to the study of form and structure. The morphological analysis of black-and-white images was initiated by Georges Matheron[1] in the mid 1960's, in his study of porous materials. Mathematical morphology provides an approach to the processing of digital images in terms of some predetermined geometric shape known as a structuring element. In mathematical morphology we study the manner in which the structuring element fits into the image. Therefore, it has the intrinsic ability to quantitatively analyze object shapes in both two and three dimensions.

Mathematical morphology treats images from the point of view of set theory. Geometrically it distinguishes itself from other image processing techniques such as syntactic techniques and signal processing techniques. Syntactic technique is based on generative grammars. These grammars establish a set of production rules which will produce the shape from certain symbols. In general these grammars tend to be quite complex for representing global properties of shape. Signal processing techniques make use of Fourier and


#### Abstract

other orthogonal transformations for image analysis. Just as a one-dimensional signal can be represented by an orthogonal series of basis functions, an image can be represented by a series of two dimensional basis functions called basis images. These basis images can be generated by unitary matrices. The series coefficients in orthogonal series expansion can be used for image processing.


In mathematical morphology, an image will be considered as a set of points and the operations, which are based on logical relations between pixels, rather than arithmetic ones, come from set theory. These are dilation and erosion, and relate directly to shape. It can be used in the areas of noise cleaning, image enhancement, feature extraction and shape analysis. Morphological operations are nonreversible. In other words, morphological operations can simplify image data which has usually too much information, preserving their essential shape characteristics, and eliminating irrelavancies. Therefore, shape description by mathematical morphology can also provide techniques suitable for image coding, that permit image transmission at low bit rates.

The main purpose of this project is to develop algorithms
and software for image analysis using morphological operations. These programs are written on the Electrical and Computer Engineering Department's AT\&T 3B2 computer, using the $C$ language. The effectiveness of these moporphological operations in image analysis applications such as noise cleaning, edge detection, region filling and image representation is also studied.

## CHAPTER 2: Mathematical morphology


#### Abstract

The objectives of computer vision or image processing are often to segment an image into objects and textures and to extract certain information for image understanding or classification. Mathematical morphological techniques are based on the analysis of images in terms of some predetermined structuring elements. Mathematical morphology provides an algebraic formulation for applying the structuring elements to the image. Both the image and the structuring elements are considered as sets of points and the sequence of different structuring elements applied to an image gives the information about the geometric measurement of the image. Such knowledge will greatly depend on the choice of structuring elements.


An image can be considered as a set, $X$, of points or pixels. With each set of points of $x$ of the space $E$, a set $B(x)$ called a structuring element can be chosen. Every set $X$ in $E$ can be modified by some $B(x)$ in several ways. The most important ones are as follows; dilation of $X=\{x \mid B(x)\{x\}$
erosion of $X=\{x \mid B(x) \subset X\}$
The dilation of $X$ by $B(x)$ is the set of all the points $x$ such that $B(x)$ hits (denoted by $\uparrow$ ) $X$. The erosion of $X$ by $B(x)$ is the set of all the points $x$ such that $B(x)$ is included in $X$. This is shown in the Figure 2-1. These two operations will play a major role in morphological analysis in image processing.


Figure 2-1 B1 hits $X, B 2$ misses $X$ and $B 3$ is included in $X$
2.1 Dilation and erosion

The language of mathematical morphology is that of set theory. Sets in mathematical morphology represent shapes. Sets in Euclidean 2-space denote binary images and sets in Euclidean 3-space may denote gray scale images. Sets in higher dimensional space may denote additional image information, such as color, etc. Morphological transformations apply to sets of any dimension. Sets in Euclidean $N$-space, or its digitized equivalent, the set of $N$-tuples of integers, denoted by $Z$ will be considered as belonging to $E$. In the following sections we define some important morphological terms.

DEF 1 : Dilation $>$ Dilation is the morphological transformation which combines two sets using vector addition of set elements. Let $A$ and $B$ be subset of $N$-space. The dilation of $A$ by $B$ is denoted by $A \oplus B$ and is defined by
$A \oplus B=\{c \in E \mid c=a+b$ for some $a \in A$ and $b \in B\}$

The dilation operation is commutative and associative,i.e, $\mathrm{A} \oplus \mathrm{B}=\mathrm{B} \oplus \mathrm{A} \quad$ (Commutative) $A \oplus(B \oplus C)=(A \oplus B) \oplus C \quad$ (associative)

Using the associative property, dilation an image $A$ by large structuring element, which itself can be expressed as the dilation of $B$ by $C$, can be computed by successive dilation by $B$ and $C$. This operation saves much operation time. Dilation by disk structuring elements corresponds to isotropic expansion algorithms common to binary image processing. This is shown in the Figure 2-2 and Figure 2-3.


Figure 2-2 Sample image for morphological operations


Figure 2-3 Dilation of sample image by circle

DEF 2 : Translation Let $A$ be a subset of $N$-space and $x \in E$. The translation of $A$ by $x$ is denoted by (A)x and is defined by
$(A) x=\{c \in E \mid c=a+x$ for some $a \in A\}$.
It is important to note that dilating a shifted image shifts the dilated image by the same amount. This property is called translation invariance of dilation,i.e.,
$(A) x \oplus B=(A \oplus B) x$

The dilation of $A$ by $B$ can be computed as the union of translations of $A$ by the elements of $B$. From the definition of translation, we can easily show that
$x \oplus\{t\}=(x) t$
$A \oplus(B) t=(A \oplus B) t$
Since $A \oplus(B \cup C)=(A \oplus B) \bigcup(A \oplus C)$ it follows directly that

$$
A \oplus B=\bigcup_{b \in B}(A) b
$$

Using this property dilation operation can be implemented in hardware easily.

DEF 3 : Erosion $>$ Erosion is the morphological dual of dilation. It is the morphological transformation which
combines two sets using the vector subtraction of set elements. The erosion of $A$ by $B$ is denoted by $A \Theta B$ and is defined by
$A \Theta B=\{x \in E \mid x+b \in A$ for every $b \in B\}$

Structuring element $B$ may be visualized as a probe which slides across the image $A$, testing the spatial nature of $A$ at every point. Erosion of $A$ by $B$ can be computed as the intersection of all translations of $A$ by the points $-b$, where $b \in B$.
$A \Theta B=\bigcap(A)-b$.
$b \in B$
Like dilation, erosion is translation invariant, i.e.,
$(A) x \Theta B=(A \Theta B) x$
This erosion operation results in a shrunken image. This is shown in Figure 2-4.

DEF 4 : Reflection $>$ Let $B \leq E . \quad$ The reflection of $B$ is denoted by $\bar{B}$ and is defined by
$\bar{B}=\{x \mid$ for some $b \in B, x=-b\}$.

Erosion and dilation are dual operations with regard to complement. Eroding $A$ is equivalent to taking the complement of the dilation of $A^{c}$.

$$
(A \Theta B)^{C}=A^{C} \oplus B^{C}
$$



Figure 2-4 Erosion of sample image by circle
2.2 Opening and closing

In practice, dilation and erosion are usually employed in pairs, either dilation of an image followed by the erosion of the dilated result, or image erosion followed by dilation. The result of iteratively applied dilations and erosions is an elimination of specific image detail smaller than the structuring element without the global geometric distortion. For example, opening an image with a disk structuring element smooths the contour, breaks narrow isthmuses, and eliminates small islands and sharp peaks. Closing an image with a disk structuring element smooths the contours, fuses narrow breaks and long thin gulfs, eliminates small holes and fill gaps on the contours. The particular significance of opening and closing is that image transformations employing these operations are idempotent, that is, their reapplication effects no futher change to the previously transformed result.

DEF 5 : Opening $>$ The opening of image A by structuring element $B$ is denoted by $A O B$ and is defined as

$$
A \circ B=(A \ominus B) \oplus B
$$

DEF 6 : Closing $>$ The closing of image A by structuring
element $B$ is denoted by $A \bullet B$ and is defined as $A \bullet B=(A \oplus B) \Theta B$

If $A$ is unchanged by opening it with $A$, we say that $A$ is open with respect to $B$, while if $A$ is unchanged by closing it with $B$, then $A$ is closed with respect to $B$. Opening and closing are both idempotent also, i.e.,
$(A \circ B) O B=A O B$
$(A \bullet B) \bullet B=A \bullet B$
Like erosion and dilation, closing and opening are dual transformations.
$(A \bullet B)^{C}=A^{C} \circ \bar{B}$
Figure 2-5 and Figure 2-6 show the opening and closing operations.

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Figure 2－5 opening of sample image by circle


Figure 2-6 Closing of sample image by circle

CHAPTER 3: Digital morphology
3.1 Image definitions

A digital image refers to a two dimensional light-intensity function denoted as $f(x, y)$, where $x$ and $y$ are independent variables denoting the spatial coordinates. The value of $f$ at any point $(x, y)$ is proportional to the brightness of that point. This brightness is called the gray level and the specific coordinates $(x, y)$ are refered to as the picture elements or pixels. In order to generate the computer program of morphological operations, systematic structure of image representation is needed. Matrix representation is a suitable form of digital image representation.

A digital image is obtained by assigning a real number, which refers to a gray level value, to each pixel in some collection of pixels. A digital image $f$ is defined as a function $f: D->R$, where $D$ is called the domain of the image $f$, and $R$ is called the codomain. Very often, the domain of a digital image will be rectangular in shape and contains a finite number of elements. In such a case a digital image will be represented in a manner similar to a matrix or a


#### Abstract

two-dimensional array. Each element of the matrix represents the gray level value of the pixel at that location. The location of a pixel in the matrix is identified by its spatial coordinates.

\subsection*{3.2 Software development}

First, imagine two stacks called DOMAIN and RANGE. Each stack contains the same number of entries, the first containing ordered pairs(i,j) and second containing real numbers. Together the stacks implicitly contain an image, for if they were popped simultaneously, the corresponding series of numbers would form a location of pixel together with its gray level. It can be written in the form of a program as follows:


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        子 IMAGE;
    With this convenient representation, several basic operations can be implemented.


#### Abstract

3.3 Fundamental operators

The following six operators can be considered as the fundamental operations which will be applied to each pixel in an image.


EXTMAX - This function compares two images in a pixelwise manner and outputs the maximum, or highest, gray value at each pixel at which both input images are defined.

MIN - This function compares two images in a pixelwise manner and outputs the image which is an intersection of the domain instead of their union. The resulting image has the pixels with lowest gray value.

TRANS - This function has the image of $f$ and two integer i and $j$ as inputs and the image that is identical to $f$ but moved over $i$ pixels to the right(along $x$-axis) and $j$ pixels down(along $y$-axis) as output.

NINETY - This function leaves the gray values of an input image intact while altering the domain of the image. NINETY rotates an input image 90 degrees in the counterclockwise direction about the origin. (In this report, this function will be used only for structuring elements.)

SUB - This function subtracts an image from an other image. When we subtract an image $B$ from an image $A$, SUB generates same image as A except those pixels of which domain is same in image $B$.

COMP - This function generates a complementary image of the input image.

Now, the basic operations, dilation and erosion, in mathematical morphology can be obtained from these fundamental functions. Suppose $A$ represents an image and $B$ represents a structuring element. Dilation and erosion can be expressed by the following equations:

$$
\begin{aligned}
\text { Dilation : } A \oplus B= & \bigcup(A) b \\
& b \in B \\
\text { Erosion : } A \Theta B= & (A(A)-b
\end{aligned}
$$

From these two expression, dilation and erosion can be implemented as in the following block diagram of Figure 3-1. Based on the definitions of opening and closing, these operations can be implemented as shown in the block diagram of Figure 3-2.


Figure 3-1 Block diagram of dilation and erosion


Figure 3-2 Block diagram of opening and closing

In this section some applications of morphological methods in digital image analysis are presented. These applications include noise cleaning, edge detection, region filling and image representation.

### 4.1 Noise Cleaning

The opening of an image $A$ by a convex set $B$ cuts down the peaks of $A$, whereas the closing of $A$ by $B$ fills up the valleys of $A$. For an image contaminated by salt-and-pepper noise, closing and opening operations can remove this noise. Opening operation suppresses the background noise spike, and closing after opening (X) cleans interior noise spike. For removing background noise spike, larger structuring element is better than smaller one. However, large structuring element may cause unacceptable distortion. So, the noise cleaning operation depends on the choice of the structuring element. It is reasonable that a large spot in backgroud is not considered as noise because it is bigger than the structuring element. The noise cleaning operation is shown in Figure 4-1 and Figure 4-2.

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Figure 4-1 Sample image with noise and image cleaned by circle




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Figure 4-2 Image cleaned by square

This closing-opening operation is comparable to median filtering. However, it needs less computation than median filtering.

4-2 Edge detection
Consider a structuring element $B$ of unit size. Then $n B$ denotes a structuring element of size $n$ obtained by dilating $B$ by itself $n$ times. If $B$ is symmetric, the erosion of $A$ by $B$ denotes a shrunken image of A. Again, the image difference $A-(A \Theta B)$ gives the boundary of a binary image. If we use $n B$ for erosion, orientation and size of $n$ will determine the orientation and thickness of boundary. The edge detection process is illustrated in Figure 4-3 and Figure 4-4.


Figure 4-3 Sample image


Figure 4-4 Edge image of sample in Figure 4-3

4-3 Region filling
This operation requires only dilation and intersection. Suppose we have an image $A$ which is the boundary of two disjoint regions and we know a point $P$ inside one of two regions. After dilating the point $P$ by a small symmetric and convex structuring element, intersect this intermediate result with $X^{c}(F i g u r e ~ 4-5)$. This $X^{c}$ limits the result of dilating effect inside the region. Iteration of dilation and intersection will make the image fully filled. Figure 4-6 and Figure 4-7 show the results after 10 and 17 iterations of dilation respectively. It is important that the structuring element should be small with regard to the thickness of boundaries.
4.4 Morphological skeleton and minimal skeleton The skeleton is a topologically equivalent thinned version of image. The skeleton $S K(X)$ of a continuous image object $X$, viewed as subsets of $2-D$ continuous space, is defined as the centers of the maximal disks inscribable inside X. A disk is maximal if it is not properly contained in any other disk totally included in $X$. Hence, a maximal disk must touch the boundary of the object $X$ at least at two different points. Some examples of skeleton are shown in Figure 4-8. This skeleton is a caricature containing


#### Abstract

  *****************: ***********************************************   ***********...********...*****************, ***********..*******!**                  **********. . . ********************, *****************\&************                             * $* * *: * * * * * * * * *: * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * 女 * *$        


Figure 4-5 Complement of edge image in Figure 4-4



```
. . . . . . . . . . . . . . . . **
```



```
. . . . . . . . ... . . . . ***** . . . . . . . . . . . . . . ***
. .................**********************
.....................*****************
. .................**********************
...............*****************:****
..........., ., , ...*********************
. . . . . . . . . . . . . . *********************
*********************
*************&*******
******************:***
..................********************
............... ...******************
. . . . . . . . . . . . . . ****************
    ***************
    ***************
    *************
....................**************....................................
```



```
\bullet., . . .
```




```
*............................................................
```

Figure 4-6 Image after 10 iterations of dilation


[^0]information about the shape, size and orientation.
The skeleton.$S K(X)$ can be obtained from the set union of Sr(X), r > 0, which denotes the rth skeleton subset, i.e., the set of the centers of the maximal disks whose radius is equal to $r$. These skeleton subsets can be obtained by using morphoplogical erosion and openings. The skeleton SK(X) is equal to
\[

$$
\begin{aligned}
S K(X) & =\bigcup S r(X) \\
& =\bigcup[(X \Theta r B)-(X \Theta r B) d r B]
\end{aligned}
$$
\]

where $r$ B denotes the disk of radius $r$ and drB is a disk of infinitesimally small radius dr. The boundaries of the eroded sets $(X \ominus r B)$ can be viewed as the propagating wave fronts of Blum's grassfires where the propagation time coincides with the radius $r$. Subtracting from these eroded versions of $X$ their opening by drB retains only the angular points, which are points of the skeleton. The original set $X$ can be reconstructed as the union for all $r>0$ of the


Fig 4-8 Example of skeleton
subsets $S r(X)$ dilated by the open disks $r B$, respectively. For digital image Serra[2] provided an algorithm for morphological,skeleton $S K(X)$ of a discrete binary image $X$ sampled on a hexagonal grid,

$$
\begin{aligned}
S n(x)=(x \Theta n B) & -(x \Theta n B) B \\
n & =0,1,2 \ldots, N
\end{aligned}
$$

## N

$$
\operatorname{SK}(x)=\bigcup_{n=0} \sin (x)
$$

where $\operatorname{Sn}(X)$ denotes the $n$th skeleton subset of $X$.
The hexagon is very good approximation to a circle, but in rectangularly sampled binary image this algorithm can be used by using symmetric convex structuring elements, such as the CIRCLE, SQUARE in Figure 4-9. If we considered these elements to have a discrete radius one, then, as in the case of the discrete hexagon, we can form similarly shaped elements of discrete radius $n$. Then nth skeleton subsets is obtained by eroding $X$ by $n B$, and then keeping from every eroded set ( $X \ominus n B$ ) only those parts which consist of


Fig 4-9 Examples of structuring element
angular points and lines without thickeness. These parts are the only ones remaining after the set difference between $(x \Theta n B)$ and its opening $(x \Theta n B) b$.

By the properties of erosion, the erosion of $X$ by $n B$ can be done much faster by successively eroding $X$ by $B n$ times. Using this method, algorithm for skeletonizing of digital image can be described as follows.

Let EROS1, EROS2, OPEN denote three accumulator sets large enough to hold the image object and its background, then skeletonization can be achieved by the following steps;

```
stepl: n = 0, EROS1 = X
step2: EROS2 = EROS1 \ominus B
step3: if EROS2 = 
    then N = n, SN(X) = EROS1 and STOP.
step4: OPEN = EROS1 ¢ B
step5: Sn(X) = EROS1 - OPEN
step6: n = n + 1, EROS1 = EROS2
and go to step 2.
```

Exact reconstruction of the image from skeleton $S K(X)$ can be achieved using the following steps;

```
stepl: n = N, A = 0
step2: A = AUSn(X)
```

step3: if $n=0$ sTOP, otherwise $A=A \biguplus B$
step4: $n=n-1$ and go to step2.
It may be possible to remove some points of the skeleton and still reconstruct the image exactly. It will be called a minimal skeleton, which is a subset of the original skeleton guaranteeing the exact reconstruction of the entire image.

Let $X$ be the original image and let $\operatorname{Sn}(X), n=0,1, \ldots, N$ be its skeleton subsets with respect to a structuring element $n B$. For each skeleton subset index $n$, shift $n B$ to all the points of $S n(X)$. This operation is equivalent to dilation of each points in $S n(X)$ by $B \quad 2 n$ times. This is the characteristic function of the set $n B$. After that add algebraically all these contributions for all points of Sn(X) and for all n. This will make gray scale image, $p g f(X)$, whose region is identical with the original image. Now, in order to decide to remove a certain point which can be removed, check first whether the value of the $p g f(X)$ at all the points of the region of support of the respective shifted characteristic function is $>=2$. If so, this region of image is supported by skeleton point more than one time. Therefore, this skeleton point can be removed and subtracted algebraically from pgf(X). This operation is repeated until all the skeleton points have been searched.

The remaining skeleton points represent the minimal skeleton. Figure 4-10 shows the skeleton of a sample image and Figure 4-11 shows its minimal skeleton.


Figure 4-11 Minimal skeleton of Figure 4-10

## CHAPTER 5: Summary and conclusions

The purpose of this report is to analyze images using mathematical morphology. The fundamental operations are implemented in computer program and some useful applications are tested by this program. As a structuring element, circle and square were used as these are convex sets and also symmetric.

For simplicity, binary images were tested. Morphlogical operations can easily be extended to gray scale images. The final results fully depends on the size and shape of the structuring element. Therefore, success of mathematical morphological methods depends on what kinds of structuring elements are used and how morphological operations are combined. Skeletonization of an image is more complex than other applications, and can be implemented by a combination of basic operations. Although minimal skeleton has less pixels, it can reconstruct the original image exactly. Using the algorithm which was used in this report, it is possible to reduce the number of pixels in the skeleton to obtain a minimal skeleton. With certain tolerance, the number of pixels in the mimimal skeleton can be reduced. However, unique way to do this is very important and not
usually easy.

## CHAPTER 6: References

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$\qquad$
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$\qquad$
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        ICASSP-88, pp. 952 - 955, April 11-14, 1988
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## APPENDIX : Computer Program Listings

This appendix includes the computer listings of some of the important routines written for this study. These routines are written to compute basic morphological operations and skeleton of image. These computer listings include only the routines which are relevent to the report.

```
/****************************************************************
    * Llegartment, or Electrigal and Computeer Ensineerins
    * Kansas State University
    * AT&T UNIX C Source file name ; m-morp,h
    ****************************************************************
    *
*
* LIESCRIFTION: This is a header file for all morfholosical
    * oferation frosrums. This filfs has the
    * definition af lMAGE structure.
    *
****************************************************************/
#define l1AX 64
typedef struct fosition
    {
    int x,
        y;
    3 POSITION;
typedef struct imase /* Type definition of IMAGE */
    C
    int size,
                                ranise[4000];
    FOSITION domBin[4000];
    F IMAGE;
typedef struct str_elemt /* Tupe defirition off */
    { /* structisring element */
    int size,
                        ranse[21];
    FOSITION domain[21];
    } STF_ELEMT;
#defince NOFMAL O
*define ERROR 1
```

```
/*****************************************************************
    * Ilefartment of Electrical and Computer Ensineerins
    * Karisas Stat,& Universits
    * AT&T UNIX C Source pile name : more.c
    ****************************************************************
    *
    *
    FUNCTION: main()
    IESCRIFTION: In this frosram morfholosical oferations
        will. be ferformי\, such as dilation, erosion,
        ofenins and closins.
    IIOCUMENTATION
    FILE: None
    ARGUMENTS: None
    RETURN: Norie
    FUNCTION
    CALLEII: dilate()
        erode()
        make_im()
        make_out()
        sub()
        come()
        ninety()
    AUTHOF: Ǩunns Hyun Yoo
    IIATE CFEATEII: 30 March 1989
REVISION:
*
***************************************************************/
#iriclude <stdio,h>>
#iriclude "m_morf.h"
main()
{
    extern IMAGE *make_im(),
                                    *dilate(),
                                    *erode(),
                                    *com:=(),
                                    *sub();
    extern int make_out(),
```

```
                                    ninety();
```



```
STR_ELEMT *rt_se;
static STK_ELEMT CIRCLE = {21. {1,1,1,1,1,1,1,1,1,1,1,1,
                                    1,1,1,1,1,1,1,1,1}, {{0,0},
                                    {0,-1},{0,-2},{0,1},{0,2},
                                    {1,0},{1,-1},{1,-2},{1,1},
                                    {1,2},{2,0},{2,-1},{2,1},
                                    {-1,0},{-1,-1},{-1,-2},{-1,1},
                                    {-1,2},{-2,0},{-2,-1},{-2,1}}},
SQUAKE := {.9, {1,1,1,1,1,1,1,1,1}, {{0,0},
                        {-1,0},{-1,1},{0,-1},{-1,-1},
                        {0,1},{1,-1},{1,0},{1,1}}},
RHOMEUS ={5,{1,1,1,1,1},{{0,0},{0,-1},
    {-1,0},{1,0},{0,1}}},
BOXNE = {4, {1,1,1,1}, {{0,0},{0,1},
    {1,0},{1,1}}};
/*--------------------------------------------------------------------------*/
/* Make structure elemerit */
/*-------------------------------------------------------------------------*/
    printf(" Select structurins elemenit:\n");
    printf(" 1. CIRCLE\n");
    printf(' 2. SQUARE\n");
    printf(" 3. RHOMEUS\n");
    printf(" 4. BOXNE\N*);
    scanf("%d", &sel);
    switch(sel)
        \ell
        Case 1:
            ft_se = &CIFCLE;
            break;
        c35e 2:
            ft_5e = &SQUARE;
            break;
        case 3:
            Ft_se = &FHOMBUS;
```

```
                            break;
    Cas!4:
        ft_se = &EOXNE;
        break;
    default:
        Ft_se = &CIFCLE;
        break;
        3
/*----------------------------------------------------------------------*/
/* Main borju :seloct morgholosical operations and infut files */
/*-------------------------------------------------------------------------*/
    Frintf(" Enter the number you want to do:\n");
printf(" 1. llilation\n 2. Erosion\n 3. Ofen \n");
frintf(" A.Close\n s. Subtract\n 6. Comp\n');
Frintf(" 7. min\n 8. Exit\n');
scanf("%d",&joh);
while(job != 8)
            {
            printf(' Enter the file name:');
            scanf("%s",name);
            switch(job)
            l
            case 1: /* Inlation */
                {
                        pt_test = make_im(name);
                make_out(dilate(rt_test, ft_se));
                break;
                3
                    case 2: /* Erosion */
                    &
                    ft_test = make_im(name);
                    makr_out(erode(ft_tert, et_se));
                    break;
                    3.
                case 3: /* Openins */
            &
                    pt_test = make_im(riame);
            pt_Open = erode(pt_test, pt_se);
            make_qut(dilate(pt_open, ft_se));
            break;
            5
                case 4: /* Closins */
                    c
            Ft_test = make_im(name);
            riruety(ft_se);
            ninety(ft_se);
            pt_close = dilate(ft_test, ft_se);
            make_out,(erode(ft_close, ft_se));
            break;
```

```
                3
    case 5: /* Substraction */
            {
            Ft_sub = &buffer;
            Ft_test := make_im(name);
            buffer = *Ft_test;
            printf(" Enter the file name:");
            scanf("%s", name);
            Ft_test = make_im(name);
            make_out(sun(8t_sub, rt_test));
            break;
            }
                case 6: /* Complement */
            r
            pt_test = make_im(name);
            make_out(comp(pt_test));
            break;
            }
                case 7: /* Min oferation */
            &
            pt_suh = ghuffer;
            Ft_tsst,:= make_im(name);
            buffer = *Ft_test;
            Frintf('Entrr the file name:");
            scanf("%s",name);
            rt_tsst,: make_im(name);
            make_out(min(ft_sub, rt_test));
            break;
            3
                defoult:
            hreak;
            }
    Frintf(" Enter the number you warit to do:\n");
    printp(" 1. Oilation\n a. Erosion\n 3. Open \n");
    printf(" 4. Close\n 5. Subtract\n 6. ComF\n");
    Frintf(" 7. Min \n &. Exit\n");
    scanf("%d",&job);
    }
    return(0) %
3
```

```
/****************************************************************
    * Ilepartment of Electrical and Computer Ensineerins
                        Kamras State University
            AT&T UNIX C Source file name : skeleton.c
    ****:k***********************************************************
    *
    *
    * FUNCTION: main()
    *
    *
    IESCFIFTION: This frosram ofens infut file and find
        skeleton and minimal skeleton imajo. User can
        choose the structurins element.
    gOCUMENTATION
    FILE: Norie
    AFGUMENTS: Norie
    FETURN: Norie
    FUNCTION
    CALLEII:
                make_im(),
                    make_ou(),
                        dilate(),
                        erode(),
                        recon(),
                        sub(),
                        min_sk_slob()
    AUTHOR: Kyuns Hyun Yoo
    IIATE CREATEII: 20 March 1989
    FEUISION:
    *
****************************************************************/
#iriclude <stdiu.h>
#include "m-morp.h"
main()
f
extern IMAGE *dilate(),
                                    *erode(),
                        *make_im(),
                        *min_sk_slob(),
                        *recon(),
                        *sıb();
```

```
            int, make_out();
            int i,
            j,
            k,
            ri
            sel; /* For structure element selectins */
char riame[10]; /* Ingut file name */
static IMAGE s[10];
IMAGE m_skel,
    temp,
    *eros1,
    *eros2,
    *oferi,
    *pt_buf;
    STR_ELENT *Pt_se;
    static STR_ELEMT CIRCLE = {21, {1,1,1,1,1,1,1,1,1,1,1,1,1,1,
                        1,1,1,1,1,1,1},{{0,0},{0,-1},
                        {0,-2},{0,1},{0,2},{1,0},{1,-1},
                        {1,-2},{1,1},{1,2},{2,0},{2,-1},
                        {2,1},{-1,0},{-1,-1},{-1,-2},
                        {-1,1},{-1,2},{-2,0},{-2,-1},
                        {-2,1}}},
                SQUAFE = {9, {1,1,1,1,1,1,1;1,1},{{-1,-1},
                        {-1,0},{-1,1},{0,-1},{0,0},{0,1},
                        {1,-1},{1,0},{1,1}}},
                                    FHOMEUS ={ {%, {1,1,1,1,1},{{0,-1},{-1,0},
                        {0,0},{1,0},{0,1}}};
/*---------------------------------------------------------------------------**/
/* Select structure elemerit */
/*----------------------------------------------------------------------------*/
    prinitf(" Select structurins element:\n");
    friritf(" 1. CIRCLE\n");
    Friritf(" 2. SQUARE\ri");
    Frintf(" 3. RHOMEUS\n");
    scarif("%d", &5el);
    switch(sel)
        &
        case 1:
            pt_se = &CIFCLE;
            break;
        case 2:
            pt_Se = &SQUAFE;
            break;
        case 3:
            Ft_se = &FHOMEUS;
```

```
            areak;
        default:
        Ft_se = &CIRCLE;
        break;
    }
/*------------------------------------------------------------------------------*/
/* Make IMAGE from infut imase file */
/*-------------------------------------------------------------------------*/
        frintip(" Enter the file name:");
        scanf("%s",mame);
        n=0;
        /* Maximum size of SE */
        erost = &temf;
        *erosi = *make_im(riame);
        eros? = erode(eros1, pt_se);
/*--------------------------------------------------------------------------------*/
/k Main boby of skeleton alsorithms */
/*----------------------------------------------------------------------------*/
    while(eros2->size != 0)
        f
            qpen = dilate(eros2, pt_se);
            pt_bur := sub(eros1, open);
/*--------------------------------------------------------------------------------****
/* Make skeleton subsets */
/*--------------------------------------------------------------------------*/
    *(s + n) = *\rhot_buf;
    *eros1 = *eros2;
    eris:2 = erode(eros1, pt_se);
    n+t;
    3
    *(s + n) = *erosi;
/*------------------------------------------------------------------------*/
/:k Make skeleton */
/*-------------------------------------------------------------------------*/
    i=0;
    m_skel.size = 0;
    for(j=0; j<= n; jt+)
        {
        m_skel.size t= s[j].size;
        for(k = 0; k < s[j].size; k++)
            f
            m_skel,domain[i].x = s[j].domain[k].%;
            m._skel.domairi[i],y=s[.j].domain[k].y;
            m_skel.ranse[i] = s[j].ranse[k];
            i++;
            3
```

```
                }
    printf("Now skeleton imase was made.\n");
    Ft_but := &m-5krl;
    make_out(pt_buf);
/* make_out(recon(s;rt_sern));
    scarf("%d",&dumm);
*/
/*-------------------------------------------------------------------------------------
/* Make minimum skeleton */
/*-----------------------------------------------------------------------------*/
    make_out(min_sk_slob(s, pt_se, n));
/* make_out(recon(s,pt_se,r));*/
        return(0);
3
```

```
/****************************************************************
    * Llepartment of Electrical and Computer Ensineerins
                        Kanisas State University
                AT&T UNIX C Source file mame : dilate.c
    ****************************************************************
    *
    *
    FUNCTION: dilate(f, s)
    NESCFIFTION: This function take an imase and a structure
        elemarit as infuts arid output a dilated imase
    IIOCUMENTATION
    FILE: None
    AFGUMENTS:
        f (infut) IMAGE *
        Pointsr to infist, IMAGE which will be dilated.
    s (input) STR_ELEMT *
        Foiritar to the strustre element which will be
        used for dilaion.
    RETURN: IMAGE *
        This function will return the pointer to
        IMAGE which will refresent the dilated imase.
    FUNCTION
    CALLEII: trans(),
        extmax()
    AUTHOR: Kyuns Hyun Yoo
    IIATE CFEATED: 20 March 1989
    REUISION:
    *
****************************************************************/
#include "m_morF&h"
IMAGE dilated; /* nilated imase */
IMAGE *dilate(t, s)
IMAGE *f; /* Iriput imase */
STR_ELEMT *s; /* Structure elemerit which will */
/* be used */
```

```
\ell
    extern lMAGE *trans(),
                *extmax();
    IMAGE *&t_dil;
    int i,
            x, /* Fosition of pixel in structure */
            y; /* element */
    Pt_dil = &dilated;
/*-------------------------------------------------------------------------*/
/* Make dilated imase bu takins union of transed imase */
/*--------------------------------------------------------------------------*/
    for(i := 0; i < s->size; i+t)
        {
        x = s->domain[i].x;
        y = s->domainl.iJ.y;
        pt_dil = extmax(trans(f, x, y), pt_dil);
        3
    return(et_dil);
3
```

```
/****************************************************************
    * Ilepartment of Electrical and Computer Ensineerins
    * Kansas State University
    * AT&T UNIX C Source file name : erode.c
    ****************************************************************
    *
    *
    FUNCTION: erode(f, s)
    IESCFIFTION: This function take an imase and a structure
    element as infuts and outpist an eroded imase
    IIOCUMENTATION
    FILE:
    Norie.
    ARGUMENTS:
    f (infut) IMAGE *
    Fonter to infut structure IMAfge which will
    be eroded.
    (input) IMAGE *
    Fointer to structure element which will be
    used for erosion.
    RETUFN: IMAGE *
        This function will return the fointer to
        structure IMA(iE which will represent the
        eroded imase.
    FUNCTION
    CALLEII: min()
        ninety()
        trans()
    AUTHOR: Kyuns Hyun Yoo
    IIATE CREATEII:
    FEUISION:
*
****************************************************************/
#include "m_morf.h*
IMAGE eroded;
IMAGFE *erode(f, s)
```

```
IMAGE **F
STR_ELEMT *s;
{
    extern IMAGE *min(),
                                    *trans();
    extern int ninety();
    int i,
        j,
        k,
        <"
        з;
        IMA(jE: *Ft_buffer,
        *Ft_erod;
    ft_eros = &eroded;
    ninety(s);
    nimety(s);
/*---------------------------------------------------------------------------*/
/* Iritialime all pi%sls in IMAGE mined to 1 */
/*---------------------------------------------------------------------------*/
    k = 0;
    for(i = 0; i < MAX; i++)
        for(j := 0; .j < MAX; j++)
            f
            pt_erod->domain[k],x = i;
            ft_eroc->domain[k].y := j;
            ft_erod->ranse[k++] = 1;
            }
    Pt_erod->size = MAX * MAX;
/*------------------------------------------------------------------------------*/
/* Erofs operation ( IMA(iE ANI opertion ) */
/*----------------------------------------------------------------------*/
    for(i == 0; i < s->size; it+)
        \ell
        x = s->domain[i].x;
        y = s->дomain[i].y;
        pt_buffer = min(trans(f, x, y), pt_erod);
        *rt_erod = *rt_buffer;
        \jmath
    returri(ft_erod);
}
```

```
/****************************************************************
    * leerartment, of Electrisal arrs Computer Ensineeriris
    * Karisas State University
* AryT UNXX D Source fil! mame : min_sk_slob,c
****************************************************************
*
*
* FUNCTION: min_sk_slob(sk_sub, pt_se, n)
*
*
*
*
*
*
* LIOCUMENTATION
    FILE: None
    ARGUMENTS:
        sk_sub (iriput) IMAGE[]
                Skeleton subset arrias of infut imase
    ft_se (iriput) sE_ELEMT
                Structuring element correspondins to
                skeletori subsets
    n (input)
                Size of skeleton subsets array
    KETURN: IMAGE *
                Fointer i,o minimal skeleton imase
    FUNCTION
    CALLEII: dilate()
                m3ke_out()
    AUTHOR: Kyuns Hyun Yoo
    IAATE CFEATEII: 30 March 1989
    REUISION:
    *
******************************************************************/
#include "m-morr.h"
IMAGE miri_sk;
IMAGE *min_sk_slob(sk_sub, pt_se, n)
IMAGE sk_sub[]; /* Array of skeleton subsets */
```



```
    extern IMAGE *dilate();
    extern int make_out();
    IMAGE min_sk_sub[10], /* Array of minimal skeleton */
    /* subsets */
    /* For temporary storase */
    /* For temporary storase */
    /* For temporary storase */
    /* psemilo sray level function */
        fgf,
    static int fi<<l[MAX][MAX];
    int i,j,k,l, /* Counter */
        x,s, /* Location of pixels */
        flas,
        size; /* Size of IMAGE */
/*-------------------------------------------------------------------------*/
/* For Oth skeleton */
/*---------------------------------------------------------------------------*/
    miri_sk_sub[0] = sk_sub[0];
/*----------------------------------------------------------------------*/
/* Maks modifierd subset!; (dialte(dilate(sk_sub))) */
/*-------------------------------------------------------------------------*/
printf(")n modif!u section\n");
    for(i = 1; i<< n; it+)
        {
        st_dummy = sk_sub + i;
        j = put;_dummy->5izej
        pt_buffer = min_sk_sub + i;
        pt_buffer->sizt= 0;
        /*-------------------------------------------------------------**/
        /* Make minimal skeleton subsets which have the sray */
        /* level. Shifted version of each fixels bus structure */
    /* element make!s tinis sray level.
        */
    /*----------------------------------------------------------------***
        while(j > O)
            { Frintf("make minimal skeleton\n");
            et_tem%= &temp;
            temf.size = 1;
            temp.domain[0].x =- pt_dummy->odomain[j-1].x;
            temp,domain[0],: = &t_dummu->domain[j-1],y施
            temf.ranse[0] = pt_dummy->rarise[j-1];
            Ft_tems: :: dilate(pt_temp, ft_se);
            k = i - 1;
            while(k > 0) /* Shiftins structure element is */
```

```
                                    /* equal to taking dilation 2 times*/
            {
            ft_temp = dilate(pt_temp, pt_se);
            k--;
            }
                size = Ft_buffer->size;
                f13:= =%
                for(k = 0; k < pt_temp->size; kt+)
            f
            for(1 = 0; 1 < size; 1++)
                    &
                    if((ft_buffer->domain[l].% ==
                                    Ft_temF->domain[k].x)&&
                                    (rt_buffer->domainll],y==
                                    pt_temF->domain[k],y))
                                    }
                                    f13s=1;
                                    pt_buffer->ranse[l] t= 1;
                    break;
                    3
                3
            if(flas== 0)
            &
            pt_buffer->domain[pt_buffer->size].x =
                                    Ft_temp->domairi[k].x;
            pt_huffer->domain[pt_buffer->size].y=
                                    Ft_temp->domain[k].y;
            pt_buffer->ranse[pt_buffer->size.7 =
                                    Ft_temp->ranse[k];
            Ft_buffer->5ize+t;
            3
        else
            flas = 0;
        }
        j--;
        3
    }
/*----------------------------------------------------------------------------*/
/* Make faf (sseuda sraytoris function) */
/*------------------------------------------------------------------------*/
FrintP("In Fof section\n");
    et_dummy = &esf;
    et_dummy-Dsize= 0;
    flas=0;
    pt_buffer = min_sk_sub;
    *Ft_dummy := *Ft_buffer; /* For oth skeleton */
    for(i := 1; i <= n; it+)
        &
        pt_buffer = min_sk_sub + i;
        size = Ft_dummy->size;
```

```
        for(.j = 0; j < Et_buffer->size; j+t)
                            /* Add all minimal skeleton */
                            /* subsets */
        \tau
        for(k = 0; k < size; k++)
            {
            if((pt_buffer->domain[j].%==
                                    pt_dummy->domain[k].x)&&
                (Ft_buffer->domain[j].y==
                                    Ft_dummy->domain[k].y))
                        {
                flas = 1;
                et_dummy->ranse[k] t= pt_buffer->ranse[j];
                break;
                3
        }
        if(flas== 0)
            {
            rt_dummy->domain[pt_dummy->size].x =
                        rt_buffer->domain[j].x;
            pt,_dumm's->domain[pt_dummy->size].y=
                        pt_buffer->domain[j].y;
            Ft_dummy->range[ft_dummy->size] =
                    ft_buffer->range[j];
        Ft_dummy->size++;
        J
        else
            flas=0;
        3
3
/*------------------------------------------------------------------------*/
/* Make fixel form */
/*----------т-----------------------------------------------------------*/
Frintf("In Fixal section\n");
    for(i = 0; i < pt_dummy->size; it+)
        {
        x = pt_dummy->domain[i].x;
        y = of;_dumms->domain[i].y;
        pixel[x][y] = pt_dummy->ranse[i];
        }
/*--------------------------------------------------------------------*/
/* Cineck tine cont,ributionsof :ixels in skeleton substs to */
/* fof function. 'If this contribution is sfeater than 2, */
/* that pi%@l can be removed. */
/*----------------------------------------------------------------------------*/
    for(i := 1; i <= ri; i++)
        &
        pt_dummy = sk_sub + i;
        j = =i,_dummy->size;
        while(j > 0)
            { printf('In checkins section\n");
                pt_temF= &temF;
```

```
    temF.size := 1;
    temf.domain[0].% =: pt_dummy->domain[j-1].к;
        temp,domain[0].! = wt_dumms-> domain[j-1].y.
        temp.ranse[0] =: pt_dummy->ranse[j-1];
        Ft_temF= dilate(Ft_temF,Ft_se);
        k = i - 1;
        while(k > 0)
        \ell
        Ft_temF = dilate(ft_temp, ft_se);
        k--;
        }
    for(k = 0; k < pt_temF->size; kt+)
        {
        < == Ft_temp->domain[k].x;
        y :: rt_tem&->domain[k],y%
        if (fixel[x][y] < 2)
            fla@ := 1;
        3
        if(flas== 0)
        &
        for(k = 0; k < pt_temp->size; k++)
            {
            x = pt_temp->domain[k].x;
            з := Ft_temp->domainlk].s;
            fixel[x][y] -= 1;
            }
    pt_dummy->domain[j-1].x = -1;
    Ft_dumms->domain[j-1].s= -1;
    pt_dummy->ranise[j-1] = 0;
    }
else
    flas=0;
.j--;
y
}
/*---------------------------------------------------------------------------*/
/* Make minimal skeleton imase from subsets */
/*---------------------------------------------------------------------*/
    i := 0;
    temp.size = 0;
    for(.j = 0; .j<<= n; j+t)
            {
            for(k = 0; k < sk_sub[j].size; k++)
            \ell
                    if ((sk_sub[j].domain[k].x >= 0) &&
                    (sh_sub[{j].domain[k].y >= 0))
            {
                    temp.domain[i].% = sk_stub[j].domain[k].x;
```

```
                    temf.domain[i].y = sk_sub[j].domain[k].y;
                    temF,ranse[i] = sk_sub[j].ranse[k];
                    i++;
                    3
        3
        3
    teme.size = i;
    pt_dumms= &temF;
    return(pt_dummy);
2
```

```
/****************************************************************
    * [lefartment, of Electrigal and Compisiter Ensineerins
    * Karisas State University
            ATgr UNXX C Source fide rime: trans.c
    ****************************************************************
    *
    FUNCTION: trans(f, x_val, y_val)
    IESCRIFTION: This function move the infut imase fover
    i fixels to the risht and j rixels down..
    IIOCUMENTATION
    FILE: None.
    AFGUMENTS:
    f (iniput) IMAGE *
            Pointer to iripist IMAGE which will be moved.
            r_val (input) int
            Imase will be moved alons the x-axis by this
            value.
    y_val (iriplt) init
            Imase will be moved alons the y_axis by this
            value.
RETURN: IMAGE *
            This function will return the pointer to
                        IMAGE whirh was moved by x-val and y_v.3l.
                    FUNCTION
                    CALLEI: None.
                    AUTHOR: Ǩuuns Hyun Yoo
                    INATE CREATEII: 20 March 1989
                    REUISION: None
    *
****************************************************************/
#im心lude "m_morp.h"
IMAGE transed; /* IMAGE which was moved */
IMAGE: *trans(r, x_val, y_val)
IMAGE *f; /* Imase which will be moved */
```

```
int <-val, /* Trans value x-axis */
        y_val;
        int i;
        IMAGF: *Ft_trans;
        pt_trans = &transed;
        *Ft_trans= *f;
/*----------------------------------------------------------------------------*/
/* Cherk inrut imase */
/*------------------------------------------------------------------------*/
    if(f->size <= 0)
        printf(" Error: Size of input IMAGE is less than O\n");
        exit(1);
        }
/*-------------------------------------------------------------------------------*/
/* Make transition imase of inflst */
/*----------------------------------------------------------------------*/
    i =0;
    while(i < f->size)
        &
        if((ft_trans->domain[i].x = f->domain[i].x + x_val) >= 64)
            Ft_trans->domain[i].% = = 64;
        if((ft_trans->domain[i].y = f->domain[i].y t y_val) >= 64)
        Ft_trans->domain[i].s -= 64;
        i+t;
        3
    return(ft_trans);
}
```



```
    * [lemartment of Electrical and Computer Ensineerins
                        Kanisas Statie University
        AT&T UNIX C Source file name : extma%.c
    ****************************************************************
    *
    *
    FUNCTION: extmax(f, s)
    NESCRIFTION: This function compares two infut imases in a
        qi<ulwise mann:or and outfut the meximum sray
        value at each fi<el.
    IIOCUMENTATION
    FILE: Norie
    ARGUMENTS:
    f (infut) IMAGE *
        Irifut IMAGE whirg will be compared
        (iriput) IMAGE *
        In;ut IMAGE which will be compared
RETURN: IMAGE *
                                This function returns a IMAGE which has the
                maximum sray value of infost imasfes.
FUNCTION
CALLEII: None
AUTHOR: Kyuns Hyun Yoo
IATE CFEATEII: 20 March 1989
REUISION:
*
****************************************************************/
#iriclude 'm_morr.h'
IMAGE extmaxed;
IMAIjF: *extma%(f,s)
\begin{tabular}{lll} 
IMAGE & \(* f\) & * Fointer to infut IMAGE */ \\
& \(* s ;\) & * Fointer to inifit IMAGE */
\end{tabular}
{
```

    irit i, /* Gerieral purpose couniter */
            jو\mp@code{as;}
                                    * General purfose counter */
        IMAGE *Ft_e%tma%;
        pt_extm;* = &extmaxed;
        flas=0;
    /*-------------------------------------------------------------------------*/
/* Check [MAGE s. lf IMAGE s hiss no pi%el, outrut IMAGE will */
/* be the same IMAGE as irraut IMAGE f */
/*-----------------------------------------------------------------------------
if(s->size == 0)
*\&t_extm3x = *f;
/*-------------------------------------------------------------------------*/
/* Check the sray valus of sach fixels and output the hishest, */
/* sray value
*/
/*-----------------------------------------------------------------------------*/
else
{
*Ft_e*tma% = *s;
for(i = 0; i <f->size; i+t)
\&
for(j = 0; j < s->size; jt+)
f
if((f->domain[i].* == pt_extma*->domain[j], %) \&\&
(अ->ふomain[i].! == pt_entman->\&omain[j].y))
{
flas = 1;
if(f->ranse[i] > extmaxed.ranse[j])
extmaxed.ranse[.j] = f->ranse[i];
break;
J
}
if(flas== 0)
{
extmaxed.domain[extma<ed.size] = f->domain[i];
extmaxed.ranse[extmaxed.size] == f->ranse[i];
extmaxed.size++;
}
else
flas=0;
}
3
return(et_e%tmax);
3

```
```

/****************************************************************
* Ller3rtment of Electrical and Computer Ensimeerins
* Karisas State Uriversity
Ar\&ir UNXX C Source file rame: min.c
****************************************************************
*
*
* FUNCTION: min(f, s)
*
*
* IESCRIFTION: This function comfares two imases in a
*
*
*
*
* nocumentation
FILE: Nonie.
*
*
*
*
*
*
*
*
*
*
*
*
*
*
*
*
* FUNCTION
CALLEII: None.
AUTHOK: Kyuns Hyun Yoo
DATE CFEATEI: 20 March 1989
FEVISION:
*
****************************************************************/
\#iriclude "m-mori*h"
IMAGE mirimmum;
IMAGGE *miri(f, s)
IMAGE *f, /* Fointer to jnfut imase */
C
init i, /* Gieneral firroose couniter */
j, /* Gener3i furfose couriter */

```
f135;
IMAGE *Ft_miri;
flas = 0;
pt_min \(=\& m i n i m u m ;\)

/* Take an intersection of infıt imases and lowest sray levil */
/* for each pixels */

minimum.size \(=0\);
for(i = 0; \(i<f->s i z e ; ~ i t+)\)
f
for \((j=0 ; j<s-\rangle s i z e ; ~ j++)\)
亿
if( (f->domain[i]. \(x==\{->\) domain[j]. \(x\) ) \& \&
(f->domain[i].y =:= s->domain[j],y)) โ
minimum.domain[minimum.size].x =: f->domein[i].x; minimum, domsin[minimum,size].s = p->domain[i],y; minimum, ranse[minimum,size] := f->ranse[i]; mirimum.sizet+;
3
3
3
return(ft_min);
3
```

/****************************************************************
* Ilepartment of Electrical and Computer Ensineerins
* K゙ansas State Uriversity
AT\&T UNIX C Source file mame : miriety.c
****************************************************************
*
*
FUNCTION: ninety(s)
IESCFIFTION: This function rotate structure element
9() desrees.
NOCUMENTATION
FILE: Norie.
AFGUMENTS:
5 (iriput/output) STR_ELEMT *
Structure element which will be rotate.
RETURN: irit
NORMAL
EFROOR
FUNCTION
CALLEII: Norie.
AUTHOR: Ǩyunis Hyun Yoo
IATE CFEATEII: 10 March 1989
REVISION: Norie
*
****************************************************************/
\#include "m-morp.h"
int ninety(s)
STR_ELEMT *s;
\&
int i,
temp;
if(s->size <= 0)
{
printf(" Error: Size of imput IMAGE is less thari O\n");
exit(1);
}

```\(/ * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * * /\)
/* Fiotate 90 desrees ..... */
/***************************************************************/

        for(i \(=0 ; i<5->5 i z e ; i+t)\)
            \{
            temp \(=s-\) - domain[i].s;

            \(s->\) дomairi[i]. \(\%=-1\) * temp;
            3
        return(NOFMAL);
3
```

/****************************************************************
* [lefartment, of Electrisal arid Computer Ensineerins
* Karisas State University
* AT\&T UNXX C Source ijle name: make_im.c
****************************************************************
*
*
FUNCTION: make_im(rame)
IIESCRIFTION: This function makes structure IMAGE from
infut, imbse file, Infut imase file is a
binary imase which was e<rressed by "1" arod
'0". Siz! of imase is 64 * 64 pixels.
IIOCUMENTATION
FILE: None.
AFGUMENTS:
name (iniput) char[]
Name of infut imase file.
FETURN: *IMAGE
This function will return the pointer to
structure IMAGE.
FUNCTION
CALLEII: None.
AUTHOR: Kyuns Hyun Yoo
IIATE CFEATEII: 20 March 1989
*
*
* FEUISION: Nonie.
*
****************************************************************/
\#irulude <stdio.h>
\#include "m_morfoh"
IMAGE orisinal; /* IMAGE which will refresent infut */
/* imese file. */
IMAGE: *make_im(riame)
char name[]; /* Name of imput imase file */
r
int c, /* Inteser value of ecch pi%el */
i, /* Genierizl purpose counter */

```
```

                j, /* General purfose couniter */
                k, /* General purfosie couriter */
    Fixel[MAX][MAX]; /* Array of fixel value */
IMAGE *Ft_im;
FILE *infile;
ft..jm = \&orisinal;
/*---------------------------------------------------------------------------*/
/* 0pen infut file */
/*--------------------------------------------------------------------------*/
if((intille :: fopen(name; "r")) == (FIl.E *) NULL)
{
printf(stderr,' Error: cannot ofen file (make_im())\n");
exit(1);
3
/*---------------------------------------------------------------------------*/
/* Make fixel array from inpist file ( MAX = 64 ) */
/*-----------------------------------------------------------------------*/
for(.j=0; j < MAX; j+t)
for(i = 0; i < MAX; it+)
Fi<<l[j][i] = 0;
Por(j = 0; j < MAX; j+t)
for(i = 0; i < MAX; it+)
f
if((c = setc(infile)) == EOF)
Fi%el[j][i] = EOF;
else if(c != '\n')
Fixel[j][i] = c - 48;
else
i--;
3
/*--------------------------------------------------------------------------*/
/* Make structure IMAljE from pi%el array */
/*---------------------------------------------------------------------*/
k:= 0;
pt_im->size=0;
for(.j = 0; .j< 'MAX; j+t)
for(i = 0; i < MAX; it+)
{
if(pixel[j][i] >= 1)
\&
pt_im->domain[k].%= i;
Ft_im->domainl:k].y = j;
pt_im->ranse[k++] = pixel[j][i];
Ft_im->siこe+t;
}
3

```
```

/*:***************************************************************
* [lepartment of Electrical arnd Computer Ensineerins
* Kian'sasi State University
AT\&T UNIX C Source file name : make_out.c
****************************************************************
*
*
FUNCTION: make_out(rt_im)
IIESCRIFTION: This function converts structure IMAGE to
imase file which has S4 * 64 pi%els. Each
pi<el will be refresented as a numberg which
is the grzy level.
IIOCUMENTATION
FILE: Nome.
ARGUMENTS:
ft_im (infut) IMAGE *
Fointer to infut structure IMAGE.
RETURN: int
NORMAL
EFFROR
FUNCTION
CALLEII: None.
AUTHOR: K゙yuns Hyun Yoo
IIATE CFEATEII: 20 March 1989
FEUISION: None.
****************************************************************/
\#ir!clude <stdio.h>
\#iriclude "m-morfoh"
irit make_out(gt_im)
IMAGE *Pt_im;
{
char name[10]; /* Name of custfut imase filee */
int i, /* General purpose counter */
j, /* General purfose counter */
*, /水 Location of fi`el */

```
```

y, /* Location of Fi%el */
Fixel[MAX][MAX]; /* Array of fixel value */
FILE *outfile;
/*----------------------------------------------------------------------------*/
/* Open output file */
/*----------------------------------------------------------------------*/
Frintf("You are soinss to make imase file\n\n");
Frintf("Enter the file name within 10 characters: ");
scanf("%s", паme);
if((outfile = fofen(nameg"'*)) == (FILE *) NILL)
{
printf(" Error: cammot ofen file (make_out())\n');
exit(1);
}
/*---------------------------------------------------------------------------*/
/* Make fi*el 3rras from structure IMAGE */
/*----------------------------------------------------------------------*/
for(j = 0; j < MAX; j+t)
for(i = 0; i < MAX; i++)
pix!l[j][i] = 0;
for(i = 0; i < Ft_im->size; it+)
{
* = Ft_im->domain[i].x;
y = pt_im->domain[i].y;
if((x>= 0) \&\& (y >= 0))
Fi%el[y][x] = \&t_im->ranse[i];
else
return(EFROR);
}
/*----------------------------------------------------------------------------------
/* Make output imase file from fixel array */

```

```

    for(j = 0; .j < MAX; j++)
        &
        for(i = 0; i < MAX; i++)
            {
            if(fixel[j][i] == 0)
                    forintf(outfile,'0');
            else if(ri`el[j][i] >= 1)
                f&rintf(outfile,'%d',pi<el[j][i]);
            else
                farintf(outfile,'*');
            }
        farintf(outfile,'\n");
        }
    fclose(outfile);
    returm(NORMAL);
    }

```
```

/****************************************************************
* Ilefartment, of Electrical anu Computer Ensinecerins

* K゙ansas State University
* Ar名 UNIX C Source Pile name : sub.c
****************************************************************
* 
* 

FUNCTION: sub(fict1, fict2)
*
*
NESCFIFTION: This function subtract a imase from the other

* imase.
IIOCUMENTATION
FILE: Nome.
AFGUMENTS:
Fict1 (infut) IMAGE*
Mirusend IMAGE
pict2 (iriput) IMAGE*
subtraherid IMAGE
RETUFN: This function returns the pointer to
subtracted imase.
FUNCTION
CALLEII: None.
AUTHOF: K゙yuns Hyun Yoo
IIATE CFEATEII: 20 March 1989
FEUISION:
*
****************************************************************/
\#include <stdio.n>
\#include "m-more.h"
IMAGF: subed;
IMAGE *sub(pict1, pict2)
IMAGE *ricti, /* Infut minusnd imasee */
*pict2; /* In:w,ut subtrherid imase */
$\uparrow$

```
```

    static int fixel1[MAX][MAX],
    ```
```

    static int fixel1[MAX][MAX],
    ```
```

    int x, /* Location of pi%el */
            3, /* goints
                                    * points
                                    */
                    i, * Couniter
    j, /* Counter */
k, /* Counter */
foint; /* Gray value difference */
IMAGE *out;
aut = 8subed;
/*-----------------------------------------------------------------------------*/
/* Initialize the fi`rel arrays */
/*--------------------------------------------------------------------------*/
for(i = 0; i < MAX; i+t)
for(j = 0; j< MAX; j++)
{
pixel1[i][j] = 0;
Fixel2[i][j]=0;
J
/*--------------------------------------------------------------------------*/
/* Make Fi*<l arrass for infist imases */
/*----------------------------------------------------------------------*/
for(i = 0; j< pict1->size; i+t)
<
% = pict1->domain[i].%;
y = fict1->domaim[i|.y;
pixel1[x][y] = 1;
3
for(i = 0; i < pict2->size; i+t)
{
x = pict2->domain[i].x;
y = pict2->domain[i].y;
Fi%el2[%][y] = 1;
3
k=0;
/*-----------------------------------------------------------------------------*/
/* Sishtract sray level */
/*------------------------------------------------------------------------------*/
for(i = 0; i < MAX; i++)
for(j=0; j< MAX; j+t)
}
foint = pixeli[i][j] - pi%el2[i][j];
if (foinit :== 1)
{
out->domain[k].x = i;
out->domain[k].y = j;
out->ranse[k] = 1;
k.++;
}

```
                    }
o|t->size == k;
return(out);
3
```


# IMAGE ANALYSIS USING MATHEMATICAL MORPHOLOGY 

by

KYUNG HYUN YOO

```
B.S., Hanyang University, KOREA, 1980
```

AN ABSTRACT OF A REPORT
submitted in partial fulfillment of the
requirements for the degree

MASTER OF SCIENCE

ELECTRICAL ENGINEERING

KANSAS STATE UNIVERSITY Manhattan, Kansas

## ABSTRACT

This report presents the application of morphological techniques to binary image analysis. Mathematical morphology provides an approach to the processing of digital image in terms of some predetermined geometric shape known as a structuring element. A brief discussion of mathematical morphology is included as a background along with some definitions of basic morphological terms. The programs for basic morphological oprations are developed using $C$ language on $A T \& T$ 3B2 computer. The results of the application of morphological techniques to applications such as noise cleaning, edge detection, region filling and image representation are also presented.


[^0]:    Figure 4-7 Image after 17 iterations of dilation

