
Image Compression based on Non-Parametric Sampling in Noisy Environments (Compression using Holes and DCT)

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Authors: 19G01: Kishan Narotam (717 931) & Nitesh Nana (720 064)

Clear workspace and command window

```
clear all
clc
close all
```

Step 1: Loading an Image

We are going to load the image into MATLAB, asking for the name of the file. The user input is typed in and converted into a string. When the file is read into MATLAB, it's read in as a 3 dimensional matrix. We display the image for manual debugging.

```
fileName = uigetfile('*.');
uploadedImage = imread(fileName);

% Display the uploaded image. The axis do not show, so we set the
% visibility to be on in order to see the pixels
figure('units','normalized','outerposition',[0 0 1 1])
subplot(1,3,1)
imshow(uploadedImage);
title(strcat('Original image: ', fileName));
axis = gca;
axis.Visible = 'On';

tic
```

Step 2: Convert the image to grayscale

Dealing with a 3 dimensional matrix is a challenge, as the third dimension is the colour map. So converting the image to grayscale will make the uploaded image into a 2 dimensional array.

```
grayImage = rgb2gray(uploadedImage);
%grayImage = uploadedImage;

% Display the uploaded image into grayscale. Again, the axis does not
show,
% so we set the visibility to be on.
subplot(1,3,2)
imshow(grayImage);
title(strcat('Grayscale image: ', fileName));
axis = gca;
axis.Visible = 'On';
imwrite(grayImage, 'OriginalImage.gif')
```

Step 3: Divide the image into the domain pool

First we need to know the height and the width of the image. From this point, when "image" is used it refers to the converted grayscale image and NOT the original colour image.

```
[heightOfImage, widthOfImage] = size(grayImage);

% Time to determine the number of 8x8 squares in the domain pool
blocksAcross = widthOfImage/8;
blocksDown = heightOfImage/8;
totalNumberOfBlocks = blocksAcross * blocksDown;
fprintf('Total number of blocks in the domain pool: %d \n',
    totalNumberOfBlocks);

% Going row by row, the blocks in the domain pool are indexed from 1
to the
% totalNumberOfBlocks. This is done by nested for loops. One way to
test it
% is to subtract an indexed block from/to the corresponding pixels
from
% imageToGray. If the resulting matrix from this subtraction is all
0s,
% then the pixels are indexed correctly.
blocks = cell(1, totalNumberOfBlocks);

blockIndex = 1;

for yIndex = 1:blocksDown
    for xIndex = 1:blocksAcross
        if (xIndex <= ((blocksAcross*8)-8))
            blocks{blockIndex} = grayImage(((8*yIndex)-7):(8*yIndex),
                ((8*xIndex)-7):(8*xIndex));
            if (blockIndex < totalNumberOfBlocks + 1)
                blockIndex = blockIndex + 1;
            end
        end
    end
end
```

```
end  
end  
end
```

Step 4: Creating the holes in each small block in the domain pool

With the image now split into the domain pool, we have an array of 8x8 matrices, with a size of totalNumberOfBlocks. The first part of this step is to move to the center square at position

```
for q = 1:totalNumberOfBlocks  
  
    % Each 8x8 block within the domain pool will always start at (1,1)  
    % being the top left pixel and (8,8) being the bottom right pixel.  
    Each  
    % 8x8 block is treated independently. For this reason, each  
    block's  
    % small center square will start at (4,4) - its respective top  
    left  
    % pixel.  
    block2x2 = blocks{q}(4:5,4:5);  
  
    % The average of the 4 blocks is calculated so that it can be used  
    as  
    % the point for the Chebychev check.  
    average = mean(block2x2, 'all');  
  
    % Since the starting square is only 2x2, this loop need only run  
    twice.  
    counter = 1;  
    for i = 1:2  
        for j = 1:2  
            temp1(counter) = pdist([block2x2(i,j);  
average], 'chebychev');  
            counter = counter + 1;  
        end  
    end  
  
    % Now we check if the Chebychev distance between each pixel and  
    the  
    % average of the square is less than 5. If they all are less than  
    5,  
    % the square size is increased from 2x2 to 4x4. If one value is 5  
    or  
    % more, no hole is created and the next block in the domain pool  
    is  
    % checked.  
    if (all(temp1 < 6))  
        block4x4 = blocks{q}(3:6, 3:6);  
  
        average = mean(block4x4, 'all');
```

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```
% With the square using Holes and DCT. The now increasing to a 4x4
size,
    % all 16 pixels are checked to see if a larger hole can be
    created.
    % The reason the smaller hole is not created first is due to
    the
    % hole (all values of 0), it changes the value of the average
    of
    % the entire square. Only if this 4x4 square cannot be a hole,
    will
    % it create the smaller hole.
    counter = 1;
    for i = 1:4
        for j = 1:4
            temp2(counter) = pdist([block4x4(i,j);
average], 'chebychev');
            counter = counter + 1;
        end
    end
    if (all(temp2 < 6))
        block6x6 = blocks{q}(2:7, 2:7);
        average = mean(block6x6, 'all');

        counter = 1;
        for i = 1:6
            for j = 1:6
                temp3(counter) = pdist([block6x6(i,j);
average], 'chebychev');
                counter = counter + 1;
            end
        end

        if (all(temp3 < 6))
            blocks{q}(2:7, 2:7) = 0;

        else
            blocks{q}(3:6, 3:6) = 0;
        end

    else
        blocks{q}(4:5, 4:5) = 0;
    end

end

end

% As a way of reconstructing the image, we take each indexed block from
the
% domain pool and combine it into 1 large 2D array that is the
grayscale
% image with holes present.
bIndex = 1;
```

```
for yIndex = 1:blocksAcross
    for xIndex = 1:blocksAcross
        holesImage((8*yIndex)-7:(yIndex*8), (8*xIndex)-7:(xIndex*8)) =
        blocks{bIndex};
        bIndex = bIndex+1;
    end
end

% The axis do not show, so we set the visibility to be on in order to
% see
% the pixels.
subplot(1,3,3)
imshow(holesImage)
title(strcat('Grayscale image with holes: ', fileName));
axis = gca;
axis.Visible = 'On';
```

Step 5: Compressing the image using a known technique

Using known techniques, we perform the compression of the chosen image. First we start by performing the dct on the image itself so that we can see where the majority of the intensity is.

```
intensityImage = dct2(holesImage);
figure('units','normalized','outerposition',[0 0 1 1])
subplot(2,3,1)
imshow(intensityImage);
title(strcat('Image showing the intensity (amplitude) of the image
for: ', fileName));
axis = gca;
axis.Visible = 'On';

% We create an input dialog box so we can get the compression depth
% for the
% image. The number will be between 1 and 8, and will determine how
% much
% compression will take place.

compressionDepth = '7';
testString = strcat(' Compression depth = ', compressionDepth);
compressionDepth = str2double(compressionDepth);

% Now to perform the actual dct compression on 8x8 blocks, we can
% create
% empty domain pools. This will be for the quantized image and idct
% and
% final compressed image.

quantizedBlocks = cell(1, totalNumberOfBlocks);
idctBlocks = cell(1, totalNumberOfBlocks);
compressedBlocks = cell(1, totalNumberOfBlocks);
```

```
for i = 1:totalNumberOfBlocks
    f = blocks{i};
    dctTemp = dct2(f);
    quantizedBlocks{i} = dctTemp;
    idctTemp = idct2(dctTemp);
    blocks{i} = idctTemp;

    dctTemp(8:-1:compressionDepth+1, :) = 0;
    dctTemp(:, 8:-1:compressionDepth+1) = 0;
    idctBlocks{i} = dctTemp;
    idctTemp = idct2(dctTemp);
    compressedBlocks{i} = idctTemp;

end

% We reconstruct the quantized blocks into an image
bIndex = 1;
for yIndex = 1:blocksDown
    for xIndex = 1:blocksAcross
        quantizedImage((8*yIndex)-7:(yIndex*8), (8*xIndex)-7:
(xIndex*8)) = quantizedBlocks{bIndex};
        bIndex = bIndex+1;
    end
end

subplot(2,2,2)
imshow(quantizedImage)
title(strcat('Quantized DCT of: ', fileName))
axis = gca;
axis.Visible = 'On';

% We reconstruct the compressed Image
bIndex = 1;
for yIndex = 1:blocksDown
    for xIndex = 1:blocksAcross
        compressedImage((8*yIndex)-7:(yIndex*8), (8*xIndex)-7:
(xIndex*8)) = compressedBlocks{bIndex};
        bIndex = bIndex+1;
    end
end

subplot(2,2,3)
imshow(holesImage)
title(strcat('Image before compression: ', fileName))
axis = gca;
axis.Visible = 'On';
% imwrite(holesImage, 'abc.png');

compressedImage255 = compressedImage/255;
```

```
subplot(2,2,4)
imshow(compressedImage255)
title(strcat('Image after compression: ', fileName, testString))
axis = gca;
axis.Visible = 'On';
% imwrite(compressedImage255, 'abc2.png');
```

Step 6: Encoding the image using Run-Length Encoding

```
for i = 1:totalNumberOfBlocks
    compressedBlocks{i} = uint8(compressedBlocks{i});
end

% The algorithm for run-length encoding was modified and adapted from
% an
% implementation that was found on the MathWorks File Exchange
% database. The
% following comment block is the license to use the code after being
% modified.

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```

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OF THE
% POSSIBILITY OF SUCH DAMAGE.
%
%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%

% The code is modified for the use of this compression technique.

encodedValues = cell(1, totalNumberOfBlocks*8);
encodedCount = cell(1, totalNumberOfBlocks*8);
encoderCounter = 1;

for i = 1:totalNumberOfBlocks

    encodingBlock = double(compressedBlocks{i});

    for j = 1:8

        encodingRow = encodingBlock(j, 1:8);
        index = 1;
        encodedValues{encoderCounter}(index) = encodingRow(1);
        encodedCount{encoderCounter}(index) = 1;

        for k = 2:length(encodingRow)
            if (encodingRow(k-1) == encodingRow(k))
                encodedCount{encoderCounter}(index) =
encodedCount{encoderCounter}(index)+1;
            else
                index = index + 1;
                encodedValues{encoderCounter}(index) = encodingRow(k);
                encodedCount{encoderCounter}(index) = 1;
            end
        end

        encoderCounter = encoderCounter + 1;

    end

end
end

```

Step 7: Introducing Errors

The error introduction is done in a completely random way. There are two options, which are both done on a bit level. The probability is based on a "coin flip" where should a random value should be chosen, that specific pixel will be affected.

```
list = {'Ones Complement', 'Individual Bit Flip'};
```

```
[ErrorMode, rf] = listdlg('Select a  
method', 'SelectionMode', 'single', 'ListString', list);  
  
probInput = inputdlg('Choose the probability:', 'Enter the value for  
probability', [1 70]);  
probInput = str2double(probInput);  
probInput = (probInput/100) * 1000;  
probInput = 1000 - probInput  
  
% The first error mode does a 1s compliment of the chosen pixel.  
% Essentially it takes the pixel value, converts to binary and using  
the ~  
% on MATLAB automatically inverst the values. It is then converted  
back to  
% a decimal number.  
if (ErrorMode == 1)  
    fprintf('Ones compliment chosen');  
    for i = 1:length(encodedValues)  
        sizeOfValue = length(encodedValues{i});  
        probability = randi([1 1000]);  
        if (probability > probInput)  
            if (sizeOfValue == 1)  
  
                temp = encodedValues{i};  
                temp = decimalToBinaryVector(temp);  
                invertedTemp = ~temp;  
                invertedTemp = double(invertedTemp);  
                encodedValues{i} =  
binaryVectorToDecimal(invertedTemp, 'MSBFirst');  
  
            else  
                position = randi([1 length(encodedValues{i})]);  
                temp = encodedValues{i}(position);  
                temp = decimalToBinaryVector(temp);  
                invertedTemp = ~temp;  
                invertedTemp = double(invertedTemp);  
                encodedValues{i}(position) =  
binaryVectorToDecimal(invertedTemp, 'MSBFirst');  
  
            end  
        end  
    end  
  
% The second error mode is dependent on the random number generated  
between  
% 1 and 8. this determines which bit will be flipped.  
elseif (ErrorMode == 2)  
    fprintf('Bit flip chosen');  
  
    for i = 1:length(encodedValues)  
        sizeOfValue = length(encodedValues{i});  
        probability = randi([1 1000]);
```

```
if (probability > probInput)
    if (sizeofValue == 1)
        temp = encodedValues{i};
        temp = decimalToBinaryVector(temp);
        invertedTemp = temp;
        randomBit = randi([1 length(temp)]);
        invertedTemp(randomBit) = ~invertedTemp(randomBit);
        invertedTemp = double(invertedTemp);
        encodedValues{i} =
binaryVectorToDecimal(invertedTemp, 'MSBFirst');

    else
        position = randi([1 length(encodedValues{i})]);
        temp = encodedValues{i}(position);
        temp = decimalToBinaryVector(temp);
        invertedTemp = temp;
        randomBit = randi([1 length(temp)]);
        invertedTemp(randomBit) = ~invertedTemp(randomBit);
        invertedTemp = double(invertedTemp);
        encodedValues{i}(position) =
binaryVectorToDecimal(invertedTemp, 'MSBFirst');

    end
end

end

end
```

Step 8: Decoding the Image using Run-Length Decoding

```
% The algorithm for run-length decoding was modified and adapted from
an
% implementation that was found on the MathWorks File Exchange
database. The
% following comment block is the license to use the code after being
% modified.

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% met:
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% notice, this list of conditions and the following disclaimer.
```

```
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% ARISING IN ANY WAY OUT OF THE USE OF THIS SOFTWARE, EVEN IF ADVISED
% OF THE
% POSSIBILITY OF SUCH DAMAGE.
%
%*****
%*****

% The code is modified for the use of this compression technique.

decodedImage = cell(1, totalNumberOfBlocks);
decoderCounter = 1;

for i = 1:totalNumberOfBlocks

    for row = 1:8
        decodedRow = [];
        for j = 1:length(encodedValues{decoderCounter})
            decodedRow = [decodedRow encodedValues{decoderCounter}
(j)*ones(1,encodedCount{decoderCounter}(j))];
        end
        decoderCounter = decoderCounter + 1;
        decodedImage{i}(row, :) = decodedRow;
    end

end
```

Step 9: Filling in the holes

Filling the holes is based around the algorithm used to create the holes as well as research done on various techniques when holes were used. the idea is to fill the hole using surrounding blocks to get an image

as accurate as possible. So when filling using Hole pixel and DCF the pixels directly above, directly left, and directly above-left of the hole pixel. It calculates the average of the 3 values and moves to the next pixel. Since the image does not transmit a specific marker for the holes, it searches for the holes the same way it creates the holes.

```
filledImage = cell(1, totalNumberOfBlocks);
for i = 1:totalNumberOfBlocks
    filledImage{i} = double(decodedImage{i});
end

for q = 1:totalNumberOfBlocks

    block2x2 = filledImage{q}(4:5,4:5);

    average = mean(block2x2, 'all');

    counter = 1;
    for i = 1:2
        for j = 1:2
            temp1(counter) = pdist([block2x2(i,j);
average], 'chebychev');
            counter = counter + 1;
        end
    end

    if (all(temp1 < 6))
        block4x4 = filledImage{q}(3:6, 3:6);

        average = mean(block4x4, 'all');

        counter = 1;
        for i = 1:4
            for j = 1:4
                temp2(counter) = pdist([block4x4(i,j);
average], 'chebychev');
                counter = counter + 1;
            end
        end

        if (all(temp2 < 6))
            block6x6 = filledImage{q}(2:7, 2:7);
            average = mean(block6x6, 'all');

            counter = 1;
            for i = 1:6
                for j = 1:6
                    temp3(counter) = pdist([block6x6(i,j);
average], 'chebychev');
                    counter = counter + 1;
                end
            end

            if (all(temp3 < 6))
                for rowPoint = 2:7
```

```

        filledImage{q}(rowPoint,colPoint) = ...
            (filledImage{q}(rowPoint-1,colPoint-1) ...
            + filledImage{q}(rowPoint-1,colPoint) ...
            + filledImage{q}(rowPoint,colPoint-1))/3;
    end
end

else
    for rowPoint = 3:6
        for colPoint = 3:6
            filledImage{q}(rowPoint,colPoint) = ...
                (filledImage{q}(rowPoint-1,colPoint-1) ...
                + filledImage{q}(rowPoint-1,colPoint) ...
                + filledImage{q}(rowPoint,colPoint-1))/3;
        end
    end
end

else
    for rowPoint = 4:5
        for colPoint = 4:5
            filledImage{q}(rowPoint,colPoint) = ...
                (filledImage{q}(rowPoint-1,colPoint-1) ...
                + filledImage{q}(rowPoint-1,colPoint) ...
                + filledImage{q}(rowPoint,colPoint-1))/3;
        end
    end
end

end

end

bIndex = 1;
for yIndex = 1:blocksDown
    for xIndex = 1:blocksAcross
        reconstructedImage((8*yIndex)-7:(yIndex*8), (8*xIndex)-7:
(xIndex*8)) = filledImage{bIndex};
        bIndex = bIndex+1;
    end
end

reconstructedImage255 = reconstructedImage/255;

figure('units','normalized','outerposition',[0 0 1 1])
imshow(reconstructedImage255)
title(strcat('Reconstructed Image with 50% Error Probability (Bit
Flip): ', fileName))
axis = gca;
axis.Visible = 'On';

```

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`%imwrite(reconstructedImage,'image.gif');`

`toc`

`CompressionRatio`

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