

UNIVERSITI PUTRA MALAYSIA

A MODIFIED CONTRAST LIMITED ADAPTIVE HISTOGRAM EQUALIZATION FOR HIGH DYNAMIC RANGE IMAGES

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A MODIFIED CONTRAST LIMITED ADAPTIVE HISTOGRAM EQUALIZATION FOR HIGH DYNAMIC RANGE IMAGES

By

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A MODIFIED CONTRAST LIMITED ADAPTIVE HISTOGRAM EQUALIZATION FOR HIGH DYNAMIC RANGE IMAGES

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Tone mapping was originally used in the field of art where artists make use of a limited palette to depict high contrast scenes. The purpose of tone mapping is to display images or videos that correspond to the visual impression of an observer when watching the original scene by reproducing contrast and brightness between the original scene and the output device.

However, the dramatically reduction of contrast and brightness induce a loss of contrast resulting in a loss of detail visibility. As a result, a fully automatic local tone mapping algorithm was introduced to increase the local contrast and reduce the loss of visual visibility. The algorithm was written by using MATLAB software.

The local tone mapping method is based on the modified contrast limited adaptive histogram equalization (CLAHE) method. The tone mapping algorithm was first

compressed using global tone mapping method. The image was then segmented into smaller parts using pixel-region-based image segmentation method. The segment regions were processed to become masks using morphological method (opening and closing method). Every mask's clip limit was then decided according to the variance and mean. This step alleviates the artifacts introduced by the original CLAHE algorithm. Original CLAHE only have one clip limit and apply to each tile but the modified CLAHE method applied different clip limit in different mask in order to expand the dynamic range of the image. Lastly, the interpolation process was then applied to the entire image to remove the artificially induced tile border.

For assessment, a subjective and an objective evaluation were conducted to evaluate the performance of the tone mapping algorithm. For subjective evaluation a survey was conducted to compare the fifteen images that had been processed by Reinhard's, Drago's, Ward's and proposed tone mapping operator. For objective evaluation, visual difference predictor (VDP) was used to compare the difference between the HDR image and the tone mapped image. The generated probability map of the proposed tone mapped algorithm was then compared with the generated probability map of Ward tone mapping algorithm. Both results show that the proposed tone mapping algorithm produces images with good visual quality by retrieving more detail and local contrast in the image if compare with other tone mapping operator. Abstrak tesis yang dikemukakan kepada Senat Universiti Putra Malaysia sebagai menemuhi keperluan untuk ijazah Master of Sains

SATU PENGUAHSUAI KONTRA TERHAD ADAPTIF HISTOGRAM PENYAMAAN UNTUK JULAT DINAMIK TINGGI IMEJ

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Pemetaan warna pada asalnya digunakan dalam bidang seni di mana artis-artis menggunakan palet yang terhad untuk menggambarkan pemandangan kontras tinggi. Tujuan pemetaan warna adalah untuk memaparkan imej atau video yang berpadanan dengan kesan visual seseorang pemerhati semasa memerhatikan pemandangan asal dengan menghasilkan semula kontra dan kecerahan di alat paparan yang bersamaan dengan pemandangan asal. Walaubagaimanapun, pengurangan drastik kontra dan kecerahan mendorong kepada kehilangan darjah penglihatan visual. Akibatnya, logaritma pemetaan warna tempatan sepenuh automatik telah diperkenalkan untuk meningkatkan kontra tempatan dan mengurangkan kehilangan penglihatan visual. Algoritma ini ditulis dengan menggunakan perisian MATLAB.

Kaedah pemetaan warna tempatan adalah berdasarkan cara penyamaan histogram penyesuaian kontras terhad (CLAHE) yang telah diubahsuai. Algoritma pemetaan warna tersebut dimampatkan terlebih dahulu dengan menggunakan kaedah pemetaan warna global. Imej tersebut kemudian dibahagikan kepada bahagian yang lebih kecil dengan menggunakan kaedah pembahagian imej berasas piksel-rantau. Rantau bahagian telah diproses dengan menggunakan kaedah morfologi (pembukaan dan penutupan). Had klip setiap topeng kemudiannya diputuskan mengikut varians dan min. Langkah ini mengurangkan masalah artifak yang diperkenalkan oleh algoritma CLAHE asal. CLAHE asal hanya mempunyai satu had klip dan digunakan atas jubin masing-masing tetapi kaedah CLAHE yang diubahsuai menggunakan had klip yang berbeza dalam topeng yang berbeza bagi memperluas julat dinamik imej. Akhir sekali, proses penyelaan kemudiannya digunakan kepada seluruh imej untuk mengeluarkan jubin sempadan buatan teraruh.

Untuk penilaian, satu penilaian subjektif and satu penilaian objektif telah dijalankan untuk menilai prestasi algoritma pemetaan warna. Bagi penilaian subjektif, sebuah kaji selidik telah dijalankan untuk membandingkan lima belas imej yang telah diproses oleh Reinhard, Drago, Ward dan algoritma pemetaan warna yang dicadangkan. Untuk penilaian objektif pula, peramal perbezaan visual telah digunakan untuk membandingkan beza antara imej HDR and imej pemetaan warna. Peta kebarangkalian yang dihasilkan oleh algoritma pemetaan warna yang dicadangkan telah dibandingkan dengan peta kebarangkalian yang dihasilkan oleh algoritma pemetaan warna Ward. Kedua-dua hasil menunjukkan algoritma pemetaan warna yang dicadangkan menghasilkan imej dengan kualiti visual yang baik dengan mengembalikan lebih banyak butiran and kontras tempatan dalam imej berbanding dengan algoritma pemetaan warna yang lain.

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Besides, I would like to thank my family and friends who always encouraged me in pursuing my studies. Finally, thanks to all those who contributed in one way or another to the success of this research. I certify that a Thesis Examination Committee has met on 22 February 2012 to conduct the final examination of Tung Li Qian on his (or her) thesis entitled " **Modified Contrast-Limited Adaptive Histogram Equalization For High Dynamic Range Images**" in accordance with the Universities and University Colleges Act 1971 and the Constitution of the Universiti Putra Malaysia [P.U.(A) 106] 15 March 1998. The Committee recommends that the student be awarded the Master of Science.

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DECLARATION

I declare that the thesis is my original work except for quotations and citations, which have been duly acknowledged. I also declare that it has not been previously, and is not concurrently, submitted for any other degree at Universiti Putra Malaysia or at any other institution.



TABLE OF CONTENTS

Page

ABSTRACT	ii
ABSTRAK	iv
ACKNOWLEDGEMENTS	vi
APPROVAL	vii
DECLARATION	ix
LIST OF TABLES	xi
LIST OF FIGURES	xii
LIST OF ABBREVIATIONS	xvii

CHAPTER

1	IN'	FRODUCTION 1	
	1.1	Tone Mapping	1
		1.1.1 Human Visual System	2
		1.1.2 The Dynamic Range of Scenes and Displays	5
	1.2	The Global and Local Tone Mapping	6
	1.3	Problem Statement	8
	1.4	Project Overview	8
	1.5	Scope of Work	9
	1.6	Objectives	10
	1.7	Thesis Contribution	11
	1.8	Thesis Organization	11
	1.9	Conclusion	12
2	L	ITERATURE REVIEW	
	2.1	Introduction	13
	2.2	Simple Global Tone Mapping	14
		2.2.1 Logarithm	14
		2.2.2 Gamma Correction	16
	2.3	Sophisticated Global Tone Mapping	22
	2.4	Local Tone Mapping	22
	2.5	Histogram	26

		2.5.1 Histogram Equalization	28
		2.5.2 Contrast Limited Adaptive Histogram Equalization	33
	2.6	Histogram Equalization Based Tone Mapping Operator	37
	2.7	Visual Different Predictor	42
	2.8	Conclusion	45
3	Ν	IETHODOLOGY	
	3.1	Overview	46
	3.2	Global Tone Mapping	48
	3.3	Modified CLAHE	54
		3.3.1 Image Segmentation	54
		3.3.2 Morphological Opening and Closing	60
		3.3.3 Block Size and Padding	65
		3.3.4 Clip Limit	70
		3.3.5 Interpolation	73
	3.4	Rendering	76
	3.5	Conclusion	77
4	R	FSULTS AND DISCUSSIONS	
-	4 1	Assessment of Tone Manning Operator	78
	4.2	Subjective Evaluation	81
		4 2 1 Outdoor Night Scene	81
		4.2.2 Outdoor Day Scene	90
		4 2 3 Indoor Scene	99
		4.2.4 Indoor with Outdoor/ Outdoor with Indoor Scene	108
	43	Overall Subjective Evaluation Performance	115
	44	Objective Evaluation	118
		4 4 1 Outdoor Night Scene	110
		4 4 2 Outdoor Day Scene	119
		4.4.3 Indoor Scene	122
		4.4.4 Outdoor with Indoor Scene	125
5	С	CONCLUSION AND FUTURE WORK	
	5.1	CONCLUSIONS AND FUTURE WORKS	128
			-
REI	FERE	NCES	130
API	PENDI	ICES	134

xi

LIST OF TABLE

	Table	Page
	2.1: Summary of CLAHE process (MathWorks, Oct 2003)	38
	2.2: Colour coding for probability detection	44
	4.1: HDR image's minimum luminance, maximum luminance and the dynamic range for outdoor night scene	82
	4.2: The statistic results of the psychophysical experiment for outdoor night scene	88
	4.3: HDR image's minimum luminance maximum luminance and the dynamic range for outdoor day scene	90
2	4.4: The statistic results of the psychophysical experiment for Outdoor Day Scene	97
	4.5: HDR image's minimum luminance maximum luminance and the dynamic range for indoor scene	99
2	4.6: The statistic results of the psychophysical experiment for Indoor Scene	106
	 4.7: HDR image's minimum luminance maximum luminance and the dynamic range for Indoor with Outdoor/ Outdoor with Indoor Scene 4.8: The statistic results of the psychophysical experiment for Indoor with Outdoor /Outdoor with Indoor Scene 	108
	4.9: Summarizes of the result for the experiment	117
	4.10: Colour coding for probability detection	119

LIST OF FIGURES

Figure	Page
1.1: Examples of scenes and their approximate level	2
1.2: The general plan of the human eye and the retina with	
the names of their principal parts.	4
1.3: Perceptual match between a real world scene and displayed image.	4
1.4: Left: Image that is captured by the camera	4
2.1: Approximation of the luminances non-linear encoding performed by the HVS. The was taken from	15
2.2 : Example of black level error (dotted red curves) versus theoretical model (solid blue curve) from (MEYLAN, 2006)	17
2.3: Histogram for different key (low, normal and high key) with the corresponding image	20
2.4: The application of gamma correction on an image with $\gamma=1$ (top), $\gamma=2.2$ (middle) and $\gamma=3$ (bottom).	21
2.5: Four basic image types histogram (Woods, 2001)	30
2.6: (a) Original image (b) The histogram equalized result	34
2.7: Image histograms before and after equalization	35
2.8: Principle of contrast limiting as used with CLAHE. (a) Histogram of a contextual region (b) Calculated cumulative histogram(c) Clipped histogram. (d) Cumulative clipped histogram:	
its maximum slope (equal to the contrast enhancement obtained) is equal	37
2.9: Comparison between the (a) standard histogram equalization method with the (b) CLAHE result	39
2.10: Data flow diagram of the High Dynamic Range Visible Difference Predictor (HDR VDP)	42

	2.11: HDR VSP with two images as input (HDR image (Upper Left) and tone mapped image (Lower Left)) and generated map of probability values (Right).	44
	3.1: Framework of the proposed method3.2 (a) Original image of the HDR image. (b) Luminance map	
	3.3: HDR mapped using Eq. 3.5 with different of τ .	52
	3.4: Luminance map of the image after the logarithm compression	53
	3.5: LDR image after the logarithm compression	53
	3.6: (a) Partitioned image 3.6(b) corresponding quadtree	55
	 3.7: Image segmentation by a split and merge procedure. (a) Original image (b) through (f) results of segmentation using function splitmerge with values of mindim equal to 2, 4, 8, 16 and 32 respectively. 	59
	 3.8: (a) Structuring element B "rolling" along the inner boundary of A (the dot indicates the origin of B). (b) Structuring element B. (c) The heavy line is the outer boundary of the opening. (d) Complete opening (shaded) (González and Woods, 2002). 	60
	 3.9: (a) Structuring element B "rolling" on the outer boundary of set A. (b) The heavy line is the outer boundary of the closing. (c) Complete closing (shaded). (González and Woods, 2002). 	61
	3.10: The structuring object for diamond shape.	62
	3.11: The structuring object for square shape	63
	3.12: Example of the image before operation of morphological	
	opening and closing	64
	3.13: Example of the image after operation of morpological closing	64
	3.14: Example of the image after the operation of morphological opening	65
	3.15: The padding process	67
	3.16: The example of padding	68
	3.17: Regular masks	69

3.18: The example of different mask corresponding to the global	
tone mapped image	72
3.19: Image before the image interpolation process	74
3.20: Example of image interpolation	75
3.21: Image after the interpolation process	75
3.22: The output image after the tone mapping process	76
4.2: The HDR image of Montreal's night scene that cannot be fully reproduced	83
4.1The HDR image of clockbui that cannot fully reproduce by LDR display	83
4.3: HDR image of the Venice's Night scene that cannot be fully reproduced	84
4.4: Comparisons of the four different rendering of the Clockbui.	85
4.5: Comparisons of the four different rendering of the Montreal's night scene image.	86
4.6: Comparisons of the four different rendering of the Venice night.	87
4.7: Column charts of the statistic results for Outdoor Night Scene	89
4.8: The overall performance of tone mapping operator for Outdoor Night Scene	89
4.9: The HDR image of Mountain Tam West that cannot be fully reproduced by LDR display	91
4.10: The HDR image of Peck Lake that cannot fully be reproduced by LDR display	91
4.11: The HDR image of Spherion Price Western that cannot be fully reproduced by LDR display	92
4.12: The HDR image Tree that cannot be fully reproduced by LDR display	92
4.13: Comparisons of the four different rendering of the Mountain Tam West scene images.	93
4.14: Comparisons of the four different rendering of the Peck Lake scene images	93

 \bigcirc

4.15: Comparisons of the four different rendering of the Spherion Price Western scene images.	94
4.16: Comparisons of the four different rendering of the Tree scene images. 95	
4.17: Column charts of the statistic results for Outdoor Day Scene	97
4.18: The overall performance of tone mapping operator for outdoor day scene	98
4.19: The HDR image Dani Cathedral that cannot be fully reproduced by LDR display	100
4.20: The HDR image Memorial that cannot be fully reproduced by LDR display	100
4.21: The HDR image Living Room that cannot be fully reproduced by LDR display	101
4.22: The HDR image Rosette that cannot be fully reproduced by LDR display	101
4.23: Comparisons of the four different rendering of the Dani Cathedral scene images.	102
4.24: Comparisons of the four different rendering of the Memorial scene images	103
4.25: Comparisons of the four different rendering of the Living Room scene images.	104
4.26: Comparisons of the four different rendering of the Rosetta scene images	104
4.27: Column charts of the statistic results for Indoor Scene	106
4.28: The overall performance of tone mapping operator for indoor scene	107
4.30: The HDR image Foyer that cannot be fully reproduced by LDR display	109
4.29: The HDR image Display 1000 that cannot be fully reproduced by LDR display	109
4.32: The HDR image Office that cannot be fully reproduced by LDR display	110
4.31: The HDR image Indoor that cannot be fully reproduced by LDR display	110
4.33: Comparisons of the four different rendering of the Display 1000 scene images.	111
4.34: Comparisons of the four different rendering of the Foyer scene images	111
4.35: Comparisons of the four different rendering of the Indoor scene images xvi	112

4.36: Comparisons of the four different rendering of the Office scene images	112
4.37: Column charts of the statistic results for Indoor with Outdoor /Outdoor with Indoor Scene	114
4.38: The overall performance of tone mapping operator for Indoor with Outdoor /Outdoor with Indoor Scene	115
4.39: The overall performance of tone mapping operator for All Test Scene	118
4.40: (a) Ward tone mapped image (b) Proposed method tone mapped image (c) Probability map generated from Ward tone mapped image (d) Probability map generated from proposed method tone mapped image	121
4.41: (a) Ward tone mapped image (b) Proposed method tone mapped image(c) Probability map generated from Ward tone mapped image (d) Probability m generated from Proposed method tone mapped image	nap 123
4.42: (a) Ward tone mapped image (b) Proposed method tone(c) Probability map generated from Ward tone mapped image (d) Probability map generated fro Proposed method tone mapped image	om 124
 4.43: (a) Ward tone mapped image (b) Proposed method tone mapped image (c) Probability map generated from Ward tone mapped image (d) Probability map generated from Proposed method tone mapped image 	126

C

LIST OF ABBREVIATIONS

CLAHE: Contrast Limited Adaptive Histogram Equalization

- CRT: Cathode Ray Tube
- HDR: High Dynamic Range
- HVS: Human visual system
- LCD: Liquid Crystal Display
- LDR: Low Dynamic Range
- LED: Light Emitting Diode
- PPD: Panel display
- SDR: Standard Dynamic Range
- VDP: Visual Difference Predictor

CHAPTER 1

INTRODUCTION

This chapter briefly introduces the tone mapping techniques which can be used to reproduce the high dynamic range (HDR) images. Differences between the standard digital image representation and the new high dynamic range imaging, the dynamic range for scenes and display, and the global and local tone mapping are explained too. The objectives of the research, problem statement and the thesis organization are also described.

1.1 Tone Mapping

Tone mapping was originally designed for the field of art where artists make use of a limited palette to depict high contrast scenes. Then this technique was later developed for the use of photography and television (K. Devlin, 2002). The purpose of the tone mapping is to display images or videos that correspond to the visual impression of an observer watching the original scene. Tone mapping also reproduce the contrast and brightness between the original scene and the output device.

For good image reproduction, tone mapping must mimic the way the human visual system (HVS) processes light information. The environment is full of wide

range levels. HVS can have the ability to instantaneously and seamlessly adapt to scenes with a HDR scene that can exceed from 0.0001 to more than 10000. Examples of scenes and their approximate level is given in Figure 1.1 (Johnson, 2005).



1.1.1 Human Visual System

As mentioned in the previous section, the HVS system has almost 10 orders of magnitude. Studies have shown that the retinal receptors have a dynamic range as high as 10 orders of magnitude (Kuhna, 2011). Scene radiances are captured by the rods and the cones in the retina and passed further to the visual pathway. However, the optic nerves which transmit the visual signal only have a dynamic range magnitude of 2 orders (Johnson, 2005). This discrepancy can be explicated by a combination of visual phenomena processed by the HVS. The overall process is often defined as human visual adaptation (E. Reinhard, 2005). HVS adapts the illumination conditions by changing the diameter of the pupil depending on the light that enters the eye. Besides, the cones adapt their sensitivities to the mean luminance in the field of view. This is given by total retinal illumination and finally the local adaption modulates local contrasts as HVS gaze visually scans the

scene. Figure 1.2 gives a general plan of the human eye and the retina with the names of their principal parts.

The image that had been captured is usually defined as linear with respect to scene-referred coordinate because their pixels have a relation to the radiance in a scene. Therefore, the main objective of tone mapping is to obtain an image from a scene referred coordinate while maintaining a perceptual match between the real scene and the displayed image, as shown in Figure 1.3. The figure shows the HVS processes the scene radiances in a non-linear manner through different adaptation processes. It forms a percept where all details are visible. Electronic devices capture the scene radiances linearly. A tone mapping operator is necessary to non-linearly encode the image as well as to map it to the display characteristics. This is to ensure that the displayed image corresponds to our memory of the original scene.

Figure 1.4 shows the difference between image captured by the camera and the scene that the observer had seen. The image that the camera captured looks too dark and loses massive amount of detail. Comparatively, the scene that the observer had seen has more contrast in the shadow and preserves more detail.

3



Figure 1.2: The general plan of the human eye and the retina with the names of their principal parts. (Original image of the eye courtesy of Rhcastilhos, Wikimedia Commons.)



Figure 1.3: Perceptual match between a real world scene and displayed image.



Figure 1.4: Left: Image that is captured by the camera

1.1.2 The Dynamic Range of Scenes and Displays

Tone mapping can also be used to match the dynamic range scene with the display device. Dynamic range of a digital image can be defined as the contrast ratio between its brightest part and the darkest part while dynamic range of a scene is the luminance ratio between the brightest and the darkest part in the scene (E. Reinhard, 2005). Scene radiance can be measured using luminance, given in candela per meter square (cd/m^2) . When the dynamic range of the digital image is lower or higher than the dynamic range of a scene, tone mapping process will either expand or compress the luminous intensity.

The dynamic range scene can be defined as the ratio of the luminance of the brightest color (white) to that of the darkest color (black). The average contrast ratio of those natural scenes is said to be 1:160. For scenes with fog, the contrast ratio is lower than the average ratio but outdoor scenes can reach the ratio of 1:1000 (Hunt, 1995). The natural scene is considered being a low dynamic range (LDR) when its dynamic range is lower than the output device. In order to view the LDR scene in the output device, the input image should be expanded to fit the output device. For the scene's dynamic range to be approximately the same as the output device, it can be defined as standard dynamic range (SDR). For the high dynamic range (HDR) scene, the dynamic range of the input image far exceeds the output device. As a result, certain parts of the displayed image will be clipped during the capturing process. The most typical HDR scene is a view of indoor room with visible scene outside the window.

Meanwhile, most of the conventional output display devices in the market are plasma panel display (PPD), cathode ray tube (CRT), liquid crystal display (LCD) and light emitting diode (LED) display. These output display devices are classified as standard display and their dynamic range is standard as oppose to HDR display which have a much larger dynamic range. Dynamic range of those displays is generally from 1:100 to 1:1000. For current technologies, dynamic range of the printer is typically from 1:50-1:1000. However, newly developed HDR displays have a contrast ratio reaching 1:200,000, with the price cost of \$49,000.

1.2 The Global and Local Tone Mapping

There are two types of tone mapping algorithm: global (spatially uniform) and local (spatially varying) (Barladian et al., 2004). For global operator, each pixel applies the same transformation, for example; logarithmic function, gamma function, and sigmoid function (see Chapter 2). Global tone mapping algorithm applies the same function to all the pixels. Consequently, these global algorithms tend to preserve the subjective perception of the scene. They have the advantage of being fast and simple which makes them suitable for camera or video processing. However, global tone mapping algorithm will cost the lost of image detail information. (Venkata Lakshmi et al., 2012)

Local tone mapping operator applies a different scale to different parts of an image. Different parts of the image will have different results which depend on

the pixel position and on the surrounding pixel value. These methods makes the local operator-based methods provide more details of the image than those global operator based methods. However, they may also cause "halo" effects or ringing artifacts in the reproduction.

When the dynamic range of the scene is approximate or lower than the output display device, it is better to use global tone mapping. If the dynamic range of the scene is far higher than the output display device, it is advised to use the global tone mapping to compress the overall dynamic range of the HDR image. After the compression, the image in this stage may lose a lot of contrast and detail of visibility. Thus, the local tone mapping must be implemented to reproduce the detail and increase the local contrast after the global tone mapping.

Recently, market starts to launch some monitors or televisions whose dynamic range is close to that encountered in the real world. These types of HDR devices make those HDR images able to display without much compression. As a result, new tone mapping technique should be developed for rending of LDR, SDR and HDR scenes to these displays. Moreover, for those images that had already tonemapped before this to suite the SDR display device, there is a need to re-tone map them to the latest HDR display device. This can be done by reverse the operation of the tone mapping.

1.3 Problem Statement

The wide range of luminance available in high dynamic range images and videos offers a high accuracy representation of natural scenes. However, the existing display devices are insufficient to directly depict the exact contents. There are a lot of industry field that really need high accuracy and visibility for images e.g. Medical and Security Purpose. Therefore a tone mapping algorithm is required to compress the wide range of luminance to display the reduced wide range of luminance of HDR data in order to match the devices' capabilities. The dramatically reduction often reduce the quality of the original quality of HDR contents. For that reason a successful tone mapping algorithm should produce a LDR image which mimic the original scene of a HDR image with high accuracy and at a minimal quality side effect.

1.4 Project Overview

In this thesis, we concentrate on the tone mapping of the HDR scene, i.e. scenes with very wide luminance ratios. The HDR scene is normally of sunny outdoor scenes or a view of indoor room with visible scene outside the window. These HDR scenes are always facing difficulty to be displayed on SDR or LDR display devices since their dynamic range is far higher than the display devices. As a result, a local tone mapping algorithm needs to be introduced to increase the contrast and reduce the loss of visual visibility caused by global tone mapping.

1.5 Scope of Work

A local tone mapping method based on the modified contrast limited adaptive histogram equalization (CLAHE) method which was originally developed for medical imaging is used to render the HDR images to SDR displays. CLAHE has effectively expanded the full dynamic range of display. Then, CLAHE method was extended to become a new local tone mapping algorithm.

The tone mapping algorithm introduced was first compressed using global tone mapping method. Then the image was segmented into smaller regions using region splitting and merging. Next, morphological operation of opening and closing were used to process the mask in order to apply the modified CLAHE in different mask. After that is to decide every mask's parameter clip limit. This step alleviates the artifacts introduced by the original CLAHE algorithm. The original CLAHE have only one clip limit and applied to each tile. The modified CLAHE method applied different clip limit in different mask in order to expand the dynamic range of the image. Software Matlab had been used to develop the algorithms of the propose method. For performance evaluation, a subjective evaluation and an objective evaluation are introduced. The subjective evaluation is conducted by compare the proposed tone mapping operator with Drago, Reinhard and Ward tone mapping algorithms. For objective evaluation, Ward (Larson et al., 1997) and proposed tone mapping algorithm was compared with a reference scene (HDR image) with HDR Visual Difference Predictor by Rafal Mantiuk. HDR VDP can predict whether differences between two images are visible to the human observer or not by generate probability map. The detection map shows how likely HVS will notice a difference between two images. Such metrics are used for testing either visibility of information or visibility of noise. The two generated probability maps was then compared to show is there any improvement of proposed tone mapping algorithm with Ward's tone mapping algorithm. This is due to the proposed tone mapping algorithm was the improved version of the Ward's tone mapping. The results shows that the proposed tone mapping algorithm has successfully preserved the HDR image local contrast and detail.

1.6 Objectives

This research is to design a tone mapping operator that achieves the following objectives:

- To design and develop a local tone mapping algorithm to reproduce high dynamic range image that match the display device.
- To design and develop a fully automatic tone mapping algorithm without deciding any input parameter.
- To conduct an assessment to compare the images processed by proposed tone mapping algorithm with other well known tone mapping operators.

1.7 Thesis Contribution

The key contribution of this thesis is the development of a modified algorithm of CLAHE. CLAHE which was originally developed for medical imaging used one clip limit value and apply to each tile to enhance the picture. In this thesis, a modified CLAHE algorithm was applied to expand the dynamic range of the image after the global tone mapping. The modified CLAHE used morphological operation of opening and closing to segment the image into smaller regions. Then, the smaller regions used different clip limit value to increase the local contrast of each region.

1.8 Thesis Organization

The thesis contains 5 chapters. **Chapter 1** introduces an overall view of tone mapping study. It addresses the research background, the purpose and objectives of the work. Thesis organization is presented in the end of this chapter.

Chapter 2 reviews the global and local tone mapping methods. The basic global tone mapping algorithms is described and some of the local tones mapping techniques are discussed. The histogram equalization and CLAHE are also introduced and lastly the tone mapping operator that based on histogram equalization is reviewed.

Chapter 3 presents the CLAHE-based local tone mapping method that we developed to render HDR images to LDR displays. We first present the treatment of the luminance channel that includes a global tone mapping processing followed by a local processing based on CLAHE. The local processing uses region splitting and merging to segment the image into smaller part and applied different clip limit at different mask.

Chapter 4 presents the results and discussions. An assessment was conducted to the fifteen images that had been processed by proposed tone mapping operator. Comparison has also been made to the Reinhard's, Drago's and Ward's tone mapping operator and the result was discussed.

Chapter 5 presents the conclusions and future works. The summary of the research is given and future work of the research is discussed.

1.9 Conclusion



The existing display devices in the market nowadays are insufficient to directly depict the exact contents for HDR images. Therefore a tone mapping algorithm is required to compress the wide range of luminance to display the reduced wide range of luminance of HDR data to match the devices' capabilities. In this chapter, general information of why tone mapping process is important was addressed out. The objectives and contribution of the proposed tone mapping were carried out.

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