

# Image Deblurring in Presence of Gaussian and Impulsive Noise

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# Image Deblurring in Presence of Gaussian and Impulsive Noise

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*by*

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June 01, 2013

## Certificate

This is to certify that the work in the thesis entitled *Image Deblurring in presence of Gaussian and Impulsive noise* by *Suman Kumar Choudhury*, bearing roll number 211CS2276, is a record of an original research work carried out by him under my supervision and guidance in partial fulfillment of the requirements for the award of the degree of *Master of Technology in Computer Science and Engineering*. Neither this thesis nor any part of it has been submitted for any degree or academic award elsewhere.

***Pankaj Kumar Sa***

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# Abstract

Image restoration is an essential and unavoidable preprocessing operation for many security applications like biometric security, video surveillance, object tracking, image data communication etc.

Images are generally degraded due to faulty sensor, channel transmission error, camera mis-focus, atmospheric turbulence, relative motion between camera and object etc. Such conditions are inevitable while capturing a scene through camera. Restoration of such images is highly essential for further image processing and other tasks.

**Keywords:** Image restoration, Impulsive noise, Gaussian noise, Motion blur, Out-of-focus blur, Regularization, Convex minimization.

The work in this thesis has been submitted to a journal and is under review. The complete thesis shall be published once the review process ends.

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# Chapter 1

## Introduction

The work in this thesis has been submitted to a journal and is under review. The complete thesis shall be published once the review process ends.

# Chapter 2

## Impulsive Noise Suppression

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## Chapter 3

# Adaptive scheme for countering Gaussian Noise

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# Chapter 4

## Regularized image restoration

The work in this thesis has been submitted to a journal and is under review. The complete thesis shall be published once the review process ends.

# Chapter 5

## Conclusion

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